

Spatial variability of chemical pedoindicators in Haplic Inceptisol under different management systems in southern Amazonas state, Brazil

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Abstract

Inceptisols are poorly developed soils with original material characteristics and high or low base saturation depending on the environment in which they developed. This study aimed to evaluate the spatial variability of chemical pedoindicators in an Inceptisol under different management systems. The study was carried out in three agricultural areas cultivated with cassava, sugarcane and an agroforestry system, with cultivation time of 15, 8 and 17 years, respectively. All the areas investigated were located in Southern Amazonas state, Brazil. In these areas, a square mesh was established measuring 70.00 x 70.00 m, with cross points spaced 10.00 m apart and a total of 64 sampling points in each grid. Soil samples were then collected at a depth between 0.00 and 0.10 m to determine organic matter, pH, calcium, magnesium, potassium, available phosphorus, potential acidity, sum of bases, cation exchange capacity and base saturation, in addition to magnetic susceptibility in all the samples, using 10 cm³ of soil. Data were analyzed using multivariate, descriptive and geostatistics. It was found that magnetic susceptibility may be a pedoindicator for areas under cassava cultivation, potential acidity for the agroforestry environment, and pH for areas under sugarcane cultivation. The agroforestry area had higher data heterogeneity, since a nugget effect was encountered for all the properties analyzed. Based on the scaled semivariograms, the lower range values indicate greater spatial variability in the sugarcane and agroforestry systems, due to the specificities of the management system.

Keywords: geostatistics, scaled semivariogram, principal component analysis.

Introduction

The absence or reduction of soil disturbance may lead to surface accumulation of nutrients (Merten and Mielniczuk 1991), due to organic waste deposition on the surface, as well as the fertilizer application mode and low degree of fertilizer mixture (Pereira et al., 2009). However, native vegetation renewal for cropping systems can cause significant changes in soil chemical properties, in the first year of implementation (Lourente et al., 2011).

In this context, the most common cropping systems in the Amazon region, such as cassava (*Manihot esculenta*), are generally small-scale; however, their cultivation plays an important role, both as a food source and job and income generator (Schons et al., 2009). On the other hand, sugarcane is socially and economically important in the

ethanol and sugar chains, as well as in generating direct and indirect jobs (Marçal, 2009) in small molasses, brown sugar, brandy and forage feed companies. Moreover, agroforestry environments are a common form of land use in the region, in which perennial woody species (shrubs and trees) are planted with agricultural and/or livestock breeding, in order to provide environmental, socioeconomic and cultural sustainability (MacDicken and Vergara, 1990).

A number of no-tillage systems have had a positive effect on soil organic matter content and quality, reflecting directly or indirectly on soil chemical characteristics (Frazão et al., 2008). On the other hand, spatial distribution of these properties in natural and transformed areas is extremely important, because soil formation processes over time and

current management systems emphasize these property variations (Cavalcante et al., 2007). Understanding them is critical to establishing management practices and evaluating the environmental effects (Cambardella et al., 1994).

In order to adopt adequate management practices, magnetic susceptibility (MS) has been widely used in discriminating soil and plant properties (Marques JR et al., 2014). Siqueira et al. (2010a) found positive correlations between organic matter and clay content, cation exchange capacity, phosphorus adsorption capacity and hematite content, indicating its use in estimating these soil properties in a pedotransfer study. In sugarcane areas, Peluco et al. (2013) reported that SM exhibits a linear spatial correlation with the recommended doses of vinasse and the capacity of soil to withstand vinasse application. Peluco et al. (2015) mapped areas with different phosphorus adsorption potentials in soil under sugarcane cultivation and natural fertility conditions. These studies reveal the potential use of this technique in strategic management planning in agricultural production environments, indicating possible changes in soil chemical quality and demonstrating why the aforementioned authors consider MS an important pedoindicator.

In this respect, geostatistical techniques are used to study the spatial variability of soil and plant properties (Zanão Junior et al., 2007; Marins et al., 2008; Vieira et al., 2011; Campos et al., 2012a, 2013; Bottega et al., 2013; Camargo et al., 2013). However, a previously planned sample collection is required and the exact spatial location of each sample point must be recorded (Montanari et al., 2012). Thus, a number of studies applying geostatistical techniques have been conducted to determine the spatial variability of soil properties (Siqueira et al., 2010), using a scaled semivariogram (Aquino et al., 2014; Oliveira et al., 2014) with Sanos software to help in sample planning (Montanari et al., 2012). Nevertheless, few studies on this issue have been performed in the Amazon region, despite being of paramount importance in mapping soil spatial variability and the use of alternative techniques to estimate soil properties, making it possible to exploit the local potential for crop production.

Thus, we hypothesized that management systems, such as cassava, sugarcane and agroforestry, may cause changes in the spatial distribution and chemical quality of Inceptisols in the Amazon region. As such, the aim of this study was to use scaled semivariograms to evaluate the spatial variability of chemical pedoindicators of a Haplic Inceptisol under different management systems in Humaitá County, Amazonas state (AM), Brazil.

Results and Discussion

Influence of crop management on soil chemical quality

The mean test values of chemical properties demonstrated differences between the environments under study (Table 1). H+Al, P, and CEC were higher for the agroforestry area, while pH in water was lower compared to cassava and sugarcane fields, which show poor soil fertility.

For agroforestry, the low pH in water is likely due to intense leaching, since the region has intense rainfall and good drainage conditions (Campos et al., 2010-2012b). The H+Al ratio in clayey soils derives from OM decomposition and

crop waste, showing the smallest OM contents in the agroforestry environment. OM decomposition releases organic compounds onto the soil surface, forming water-soluble organic complexes of Ca and Mg with organic binders (Miyazawa et al., 1993), which facilitates cation percolation through the soil profile (Franchini et al., 1999), resulting in soil acidification.

Higher pH, OM, Ca, Mg, BS and V% values were observed in the sugarcane field. The amount of liming and fertilizer application contributed to increasing base content. In addition, these values were influenced by plant residue management at harvest, as well as industrial organic waste applied to the crop, such as filter cake and vinasse, which increases OM levels in the soil (Ribeiro and Pesquero, 2010). However, in the cassava crop, only K showed higher content than in sugarcane, with values similar to those found in agroforestry. Moreover, MS was greater in the cassava field, followed by sugarcane, which might be related to the high clay content in both areas.

Based on variations in chemical properties between management systems, we performed factor analysis (Table 2). This procedure helped select properties with higher factor loading, as determined by the varimax method, whereby the properties that exhibit discriminatory power compatible with the management systems under study can be established. These attributes could be considered potential indicators of environmental changes. These studies are required for areas with high environmental sensitivity, such as those found in the deforestation arc of Southern Amazonas.

The first two factors explained 79.3% of total variance, and OM, P and K did not have high factor loading. The pH, H+Al, Ca, Mg, BS, CEC and SB were the most relevant properties for Factor 1, explaining 66.42% of total variance, while MS is related to Factor 2, which explained 12.88% of the variance. Principal component analysis (PCA) was performed using high discriminatory power variables (Figure 1). The PCA explained 96.07% of the total variance in the first two components (PC1 and PC2) of the selected data. Furthermore, it was possible to evaluate interactions between properties and the management system. MS is directly related to cassava management, and CEC and H+Al with the agroforestry area. BS, V%, Ca, Mg and pH are related to the sugarcane area, which accounted for continuous lime and fertilizer applications, contributing to higher base contents. This indicates that these properties may be the most sensitive to change and, therefore, better able to reflect local balance alterations than other properties. As such, they can be considered indicators of environmental changes.

SM was indicated for cassava management because this area has higher clay content, when compared to other locations (Figure 1). According to Siqueira et al. (2010), there is a positive relationship between clay content and MS, given that it is an intrinsic soil characteristic and reflects soil mineralogy. With respect to sugarcane, BS, V%, Ca, Mg and pH occur due to the continuous application of limestone and fertilizers that contribute to an increase in base content. In cassava, CEC and H + Al are linked to organic matter and plant waste decomposition, which forms water-soluble organic complexes of Ca and Mg with organic binders (Miyazawa et al., 1993), facilitating cation leaching along the soil profile.

Table 1. Mean test values of chemical properties at a depth of 0.00-0.10 m in the management systems studied in Humaitá County – AM, Brazil.

Parameters	Chemical properties										
	pH H ₂ O	H+Al mol _c dm ⁻³	OM g dm ⁻³	P mg dm ⁻³	K	Ca	Mg cmol _c dm ⁻³	SB	CEC	V %	MS 10 ⁻⁸ m ³ kg ⁻¹
Cassava											
Mean	3.9b	15.77b	27.69b	6.03b	0.14a	0.23b	0.13b	0.51b	16.2b	3.26b	56.53a
Agroforestry											
Mean	3.8 c	18.95a	20.58c	8.19a	0.11a	0.23b	0.13b	0.48b	19.43a	2.52b	20.73b
Sugarcane											
Mean	4.4a	8.96c	30.48a	6.36b	0.05b	0.14a	0.81a	2.31a	11.27c	21.06a	5.78c

* Means followed by the same uppercase letter in the column do not differ statistically according to Tukey's test at 5% probability; H+Al = potential acidity; OM = organic matter; P = phosphorus; K = potassium; Ca = calcium; Mg = magnesium; SB = sum of bases; CEC = cation exchange capacity; V = base saturation

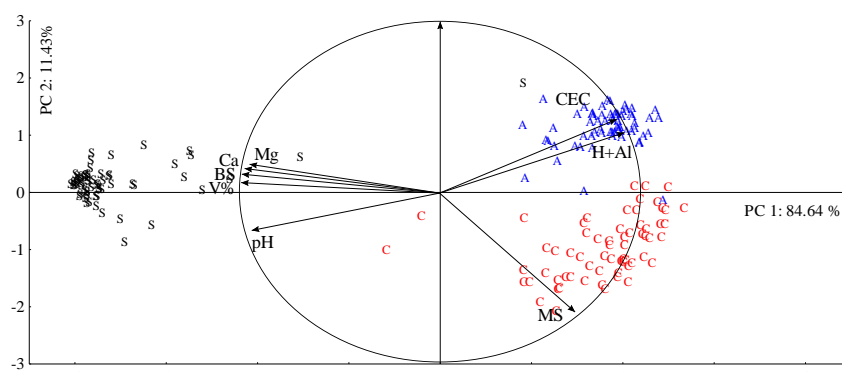


Fig 1. Principal component analysis (PCA) of chemical properties and magnetic susceptibility (SM) of the soil, with high discriminatory power of the areas under cultivation S = cane; C = cassava; A = agroforestry. H+Al = potential acidity; Ca = calcium; Mg = magnesium; SB = sum of bases; CEC = cation exchange capacity; V = base saturation.

Table 2. Factors extracted by principal component analysis, emphasizing the chemical properties of factor loading above 0.7 (module) for the management systems in Humaitá – AM, Brazil.

Variables	Factor 1	Factor 2
pH H ₂ O	0.983813	0.035209
Potential acidity	-0.956561	0.103229
Organic matter	0.574255	-0.163449
Phosphorus	-0.363696	0.678398
Potassium	-0.374322	-0.462004
Calcium	0.959594	0.233058
Magnesium	0.935195	0.224003
Sum of bases	0.955261	0.201596
Cation exchange capacity	-0.915057	0.175811
Base saturation	0.969095	0.168662
Magnetic susceptibility	-0.483930	-0.776340
Eigenvalues	7.306691	1.416438
% Total variance	66.42447	12.87671
Cumulative eigenvalue	7.306691	8.723129
% Cumulative	66.42447	79.30118

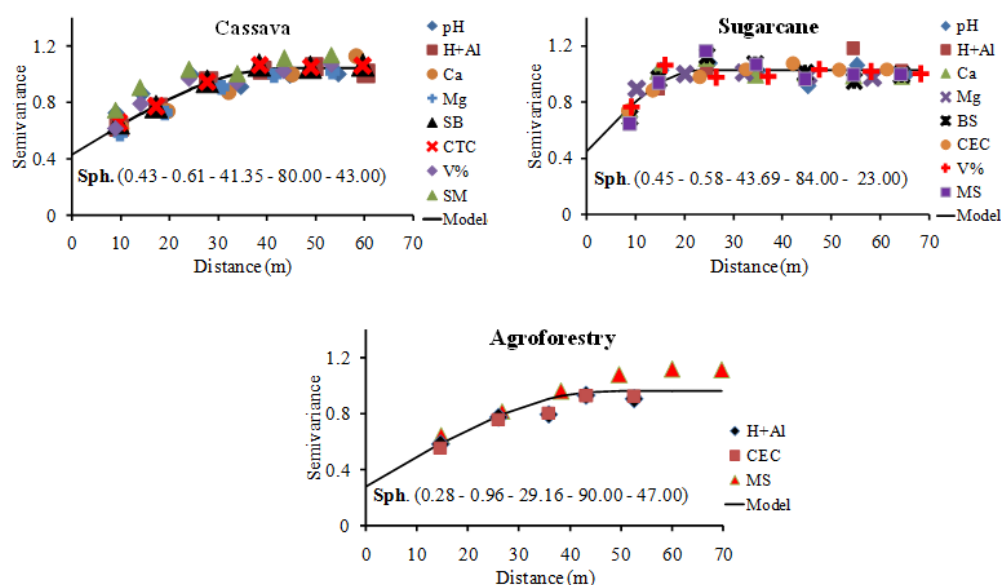


Fig 2. Scaled semivariograms adjusted to the soil chemical properties with high discriminatory power for the management systems evaluated in Humaitá - AM, Brazil. Sph. = spherical; [model (nugget effect - variance – DSD - R^2 – range)]. DSD= degree of spatial dependence; R^2 = coefficient of determination.

Table 3. Descriptive statistics of soil chemical properties with high discriminatory power for the management systems studied in Humaitá County – AM, Brazil.

Parameters	Chemical properties							
	pH	H+Al	Ca	Mg	SB	CEC	V	MS
Cassava								
Mean	3.91	157.69	2.38	1.39	5.16	162.85	3.26	56.53
Median	3.90	150.00	2.00	1.00	4.40	156.40	2.79	53.50
SD	0.06	16.10	0.52	1.06	2.00	15.08	1.58	10.68
Variance	0.00	259.23	0.27	1.13	3.99	227.49	2.49	114.09
CV	1.53	10.21	21.87	76.47	38.69	9.26	48.19	19.00
skewness	0.77	0.02	0.88	6.02	3.31	0.21	3.62	1.62
d	0.39*	0.25*	0.41*	0.36*	0.23*	0.20*	0.21*	0.14*
Agroforestry								
Mean	3.78	189.52	2.39	1.36	4.86	194.37	2.52	20.73
Median	3.80	185.00	2.00	1.00	4.15	191.40	2.20	20.00
SD	0.06	17.54	0.55	0.48	1.15	17.45	0.66	6.23
Variance	0.00	307.78	0.31	0.23	1.33	304.44	0.44	38.77
CV	1.53	9.26	23.11	35.58	23.73	8.98	26.24	30.00
skewness	-0.48	-0.51	1.03	0.60	0.67	-0.51	0.75	1.06
d	0.06 ^{ns}	0.05 ^{ns}	0.09 ^{ns}	0.10 ^{ns}	0.28*	0.24*	0.18*	0.12*
Sugarcane								
Mean	4.43	89.64	14.58	8.06	23.13	112.77	21.06	5.78
Median	4.50	80.00	15.00	8.00	23.30	107.50	21.6	5.00
SD	0.15	21.09	4.17	2.84	6.92	18.35	6.83	3.80
Variance	0.02	444.68	17.42	8.06	47.85	336.85	46.70	14.43
CV	3.39	23.52	28.63	35.21	29.90	16.27	32.44	66.00
skewness	-0.85	2.96	0.07	0.75	0.33	3.30	-0.12	3.23
d	0.05 ^{ns}	0.15*	0.03 ^{ns}	0.07 ^{ns}	0.06 ^{ns}	0.19*	0.05*	0.25*

SD = standard deviation; CV = coefficient of variation; d = normality test, *significant according to the Kolmogorov-Smirnov test. H+Al = potential acidity; Ca = calcium; Mg = magnesium; SB = sum of bases; CEC = cation exchange capacity; V% = base saturation; MS= magnetic susceptibility; * = significant; ns= non-significant.

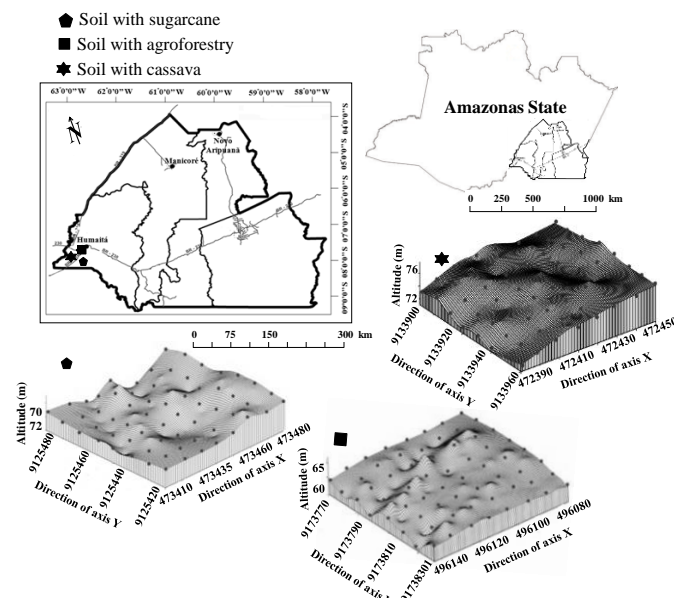


Fig 3. Location map and digital elevation model of areas cultivated with cassava, sugarcane and agroforestry, located in Humaitá country - AM, Brazil. OBS: Mudar para 'Direction of x-axis' e 'Direction of y-axis'.

Table 4. Models and parameters estimated by semivariograms of soil chemical properties with high-discriminatory power for the management systems studied in Humaitá - AM, Brazil.

Statistics	pH	H+Al	Ca	Mg	SB	CEC	V	MS
Cassava								
Model	Sph.	Sph.	Sph.	Sph.	Sph.	Sph.	Exp.	Exp.
Nugget effect (C_0)	0.01	83.20	0.10	0.07	0.41	$2.98e^{-003}$	0.10	13.20
Range (a)	28.82	41.20	54.35	49.05	31.50	44.20	41.40	28.50
DSD	48.40	61.80	56.50	60.50	57.90	58.00	83.70	0.94
R^2	0.89	0.99	0.72	0.99	0.93	0.99	0.93	0.93
Agroforestry								
Model	PNE	Exp.	PNE	PNE	PNE	Sph.	PNE	Sph.
Nugget effect (C_0)	-	$3.9E^{-004}$	-	-	-	93.70	-	15.59
Range (a)	-	45.60	-	-	-	52.50	-	57.60
DSD	-	94.00	-	-	-	67.00	-	0.55
R^2	-	0.77	-	-	-	0.96	-	0.95
Sugarcane								
Model	Exp.	Sph.	Sph.	Sph.	Sph.	Sph.	Sph.	Sph.
Nugget effect (C_0)	1.18^{-004}	14.14	0.03	0.001	0.13	9.31	0.001	0.56
Range (a)	37.60	66.58	65.94	54.00	44.75	68.17	19.80	20.30
DSD	0.82	0.94	0.90	1.00	0.88	0.95	0.69	0.96
R^2	0.60	0.96	0.49	0.90	0.34	0.97	0.94	0.83

DSD= degree of spatial dependence; R^2 = coefficient of determination; Exp. = exponential; Sph. = spherical; PNE = pure nugget effect; H+Al = potential acidity; Ca = calcium; Mg = magnesium; SB = sum of bases; CEC = cation exchange capacity; V = base saturation; MS= magnetic susceptibility.

Spatial variability of soil properties

To understand the interaction between pedoindicators and management systems, the latter were evaluated spatially. Most of the properties obtained values close to the mean and median (Table 3), indicating normal distribution, which is considered acceptable in geostatistical studies (Gonçalves and Folegatti, 2002). However, some properties exhibited values away from zero, indicating asymmetric distribution, which can be confirmed by higher asymmetry values, demonstrating the influence of extreme values. The results of the Kolmogorov-Smirnov test showed normality for some of the properties at the study sites (Table 3). However, most of the variables did not show data normality in the different

environments. The CV values indicated low variability ($CV < 12\%$) for pH in all crops, H+Al and CEC in agroforestry and cassava (Table 1). Mean CV values ($12\% < CV < 24\%$) for BS and Ca in agroforestry, H+Al, CEC in sugarcane and MS and Ca in cassava showed moderate variability. The other variables exhibited high values ($CV > 24\%$). Sugarcane and agroforestry had more variables with a high CV, demonstrating high property variability in these areas. Montanari et al. (2012), Souza et al. (2004) and Wortmann et al. (2009) found low, moderate and high CV for a number of chemical properties, showing the influence of fertilization management in cropping systems. The coefficient of variation makes it possible to compare the sample variability of variables with different units, but does not analyze the spatial variability of soil properties or their spatial patterns

(Camargo et al., 2008). To that end, data with high discriminatory power underwent geostatistical analysis, showing spatial dependence, which is expressed by adjusted semivariograms (Table 4).

The spherical model was predominant for the study areas. However, the exponential model was adjusted in cassava for V% and MS; in agroforestry for H+Al, and in sugarcane for pH. This same trend was detected for scaled semivariograms (Figure 2). Models fit to the variables describe property behavior, since, as stated by Isaaks and Srivastava (1989), exponential models are best fitted to small-scale erratic phenomena, while their spherical counterparts describe properties with high spatial continuity, or less erratic on a small-scale, i.e., value transition is less abrupt. According to Carvalho et al. (2002), the spherical model is prevalent in soil sciences. On the other hand, McBratney and Webster (1983), Bertolani and Vieira (2001) and Siqueira et al. (2010) highlight spherical and exponential models as the most widely used in soil and environmental sciences.

Some properties showed no spatial dependence, characterized by the pure nugget effect (PNE), mainly for the agroforestry area (Table 4 and Figure 2). When the variable is spatially independent, C_0 (nugget effect) is equal to $C_1 + C_0$ (sill). The PNE may occur due to measurement errors, sampling errors, or non-detected micro variations, considering the sampling space greater than needed to detect spatial dependence (Cambardella et al., 1994; Zanão Júnior et al., 2010).

The degree of spatial dependence (DSD) for individual semivariograms, expressed by the ratio between the nugget effect (C_0) and sill ($C_0 + C$) (Cambardella et al., 1994), was classified as moderate for almost all the properties in all the environments (Table 4 and Figure 2). For scaled semivariograms, the variables also showed moderate DSD, possibly due to soil homogeneity.

The range of semivariograms for individual and scaled properties showed that the sugarcane area has lower spatial dependence and greater variability, with range values of 23 m. In this respect, range is an important measure in planning and experimental evaluation, since it may help establish sampling procedures (McBratney and Webster 1983; Souza et al., 2009).

The characteristics of the agroforestry area, an environment in the recovery process, differ from those of sugarcane and cassava cropping areas, because recovery time was not enough to obtain a new equilibrium (Oliveira et al., 2015). Thus, these results may be the basis for further research aimed at soil mapping, since these environments are representative of the region and few studies are being carried out in these areas.

Materials and methods

Study area description

The study was conducted on three farms located in Humaitá County, Southern Amazonas state. The cassava crop area is situated at geographical coordinates 7° 49' 42" S latitude and 6° 15' 05" W longitude, at an average altitude of 71 m. The sugarcane crop lies at 7° 54' 38" S and 63° 14' 27" W, at an average altitude of 70 m. The agroforestry area is located at 7° 28' 29" S and 63° 02' 07" W, with an average altitude of 63 m (Figure 3). According to the Köppen classification

system, climate is classified as tropical rainy, with a short dry season (Am), temperatures ranging between 25 and 27 °C, average annual rainfall of 2,500 mm, a rainy season between October and June, and relative air humidity between 85 and 90%. Soil source material comes from ancient alluvial sediments, which belong to the Holocene period (Brazil, 1978) and the soil was classified as Plinthic Alithic Haplic Cambisol (Inceptisol), with moderate, medium texture (CXalf) (EMBRAPA, 2013). Physical characterization of management systems can be found in Oliveira et al. (2013).

Forest areas have two clearly distinct typologies: dense rainforest that evolved from a combination of climatic factors extremely favorable to the development of biological activities, such as abundance of light, water and temperature. On the other hand, open rainforest is characterized by the presence of widely spaced trees, allowing light to penetrate to the lower strata (Campos, 2009).

In these areas, a regular square mesh measuring 70.00 x 70.00 m or approximately 0.49 ha, was established, where soil was sampled at cross points spaced 10.00-m apart, at a total of 64 points in each grid (Figure 1). These points were georeferenced by a Garmin Etrex GPS device (South American Datum - SAD 1969).

Characterization of study areas

Three areas under different cropping systems were selected in this region of the Amazon:

- Cassava: Area under 15 years of continuous cassava cultivation; received liming and fertilization; and harrowed in the second year of cultivation. The crop was in the fourth month of cultivation. In the last year before planting, harrowing was carried out to a depth between 0.00 and 0.40 m.
- Sugarcane: Area cultivated under sugarcane for over eight years, using manual harvesting after burning. In the last year, plants were cut and burned for crop renewal, and soil was harrowed, limed and fertilized once, according to crop needs.
- Agroforestry: Area under an agroforestry system for 17 years using Amazonian fruit species (cupuaçu, cacao, açaí, bacaba, mango etc.). Liming and fertilization had never been performed; it was managed with hand tools (hoes and scythes).

Chemical analysis

Soil samples were collected between May and June 2011. Deformed soil samples were collected at a depth of 0.00-0.10 m for chemical analysis. Analysis found amounts of exchangeable calcium (Ca), magnesium (Mg), potassium (K), available phosphorus (P) and potential acidity (H+Al), using a method developed by Raij et al. (2001). Based on the results, we calculated the sum of bases (SB), cation exchange capacity (CEC) and base saturation (V %). The pH was measured with a potentiometer at a 1:2.5 soil/water ratio (EMBRAPA, 2011). Total carbon was determined by the Walkley-Black method modified by Yoemans and Bremner (1988) and organic matter (OM) was estimated by organic carbon.

Magnetic susceptibility

Magnetic susceptibility (MS) was determined using fine air-dried soil samples (FADS) using a Bartington MS2 susceptibility meter coupled to a Bartington MS2B sensor. Evaluation was carried out at a low frequency (0.47 kHz) (Dearing, 1994). A single reading is indicated for the more accurate results (Bartington, 2013); this methodology was adopted in the present study.

Statistical analysis

Data were submitted to variance analysis (ANOVA), and means compared by Tukey's test at 5% probability, using Minitab statistical software (Minitab, 2000). However, considering the multivariate structure of the data, multivariate statistical techniques were applied to establish chemical properties with discriminatory power and can be considered as potential indicators of environmental changes, and to check similarities between management systems in order to group them according to their chemical properties. Factors were analyzed to relate a set of variables to be explained to a limited number of new variables. We chose to use the principal component extraction (Jeffers, 1978), calculated from the correlation matrix between variables. To facilitate interpretation, we used the orthogonal varimax rotation method (Hoffmann, 1992).

Factor analysis was complemented by principal component analysis (PCA) to obtain a smaller set of linear combinations of the selected variables to analyze factors that have maintained most of the information provided by the original variables (Silva et al., 2010). This analysis makes it possible to assess how properties interact qualitatively at the same time. Original values were normalized to a mean of zero and variance of one to determine the variables used in PCA. Components were selected according to their eigenvalues, which had to be above 1.00 and able to synthesize a cumulative variance above 70% (Hair et al., 2005). These data were used to establish the chemical properties considered potential pedoindicators for environmental changes.

Based on the interaction between the chemistry and the management systems under study, these data underwent exploratory analysis, calculating mean, median, standard deviation, variance, coefficient of variation (CV), skewness and Kolmogorov-Smirnov test for normality. The coefficient of variation (CV%) was calculated based on Warrick and Nielsen (1980), who classified CV as low (<12%), medium (from 12 to 24%) and high (> 24%).

Geostatistical Analysis

Spatial dependence was determined by modeling semivariograms using geostatistical analysis (Isaaks and Srivastava 1989). Under the theory of intrinsic hypothesis, Equation 1 estimated the experimental semivariogram:

$$\hat{\gamma}(h) = \frac{1}{2N(h)} \sum_{i=1}^{N(h)} [Z(x_i) - Z(x_i + h)]^2 \quad (1)$$

where $\gamma(h)$ is the semivariance value for a distance h ; $N(h)$ the number of pairs involved in semivariance calculation;

$Z(x_i)$ the Z attribute value at point x_i ; $Z(x_i+h)$ - Z attribute value separated by distance h from point x_i .

A scaled semivariogram was built based on experimental semivariogram parameters of soil attributes. The experimental semivariogram was scaled dividing semivariances by statistical variance (Isaaks and Srivastava 1989). In the present study, semivariograms were scaled to reduce them into a same scale, facilitating comparison between the results of different variables. Furthermore, several semivariograms were analyzed simultaneously to better understand similarity standards and the causes of spatial variability (Ceddia et al., 2009).

The spherical (Equation 2) and exponential (Equation 3) models were fit to the experimental scaled semivariograms, identified in the figures as Sph. / Exp. $(C_0 - C_1 - [(C_0/(C_0+C_1)) - R^2 - a])$:

$$\begin{cases} \hat{\gamma}(h) = C_0 + C_1 \left[\frac{3}{2} \left(\frac{h}{a} \right) - \frac{1}{2} \left(\frac{h}{a} \right)^3 \right], & \text{se } 0 < h < a \\ \hat{\gamma}(h) = C_0 + C_1, & \text{se } h \geq a \end{cases} \quad (2)$$

$$\gamma(h) = C_0 + C_1 \left[1 - \exp\left(-\frac{3h}{a}\right) \right], \quad h \geq 0 \quad (3)$$

Where C_0 = nugget effect; $C_0 + C_1$ = sill; h = distance between two observations; a = range of spatial dependence. The nugget effect represents unexplained variability, considering the sampling distance used (Vieira, 2000).

We used the classification developed by Cambardella et al. (1994) to analyze the degree of spatial dependence (DSD) of the study variables, in which $[(C_0/(C_0+C_1))*100]$ values lower than 25% are considered strong, between 25 and 75% moderate, and greater than 75% weak.

Conclusion

Magnetic susceptibility can be a pedoindicator for cassava crop areas, while potential acidity and pH serve this function in agroforestry environments and sugarcane fields, respectively. The agroforestry environment displayed greater data heterogeneity, with a pure nugget effect for almost all the properties assessed. Based on the scaled semivariogram, sugarcane and agroforestry areas had higher data variability and lower range values.

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