Article

Agroecological Practices and the Typology of Milk Production Systems in Brazilian Rural Settlements

Murilo Sabater da Silva Guerra *, Ferenc Istvan Bánkuti, Alessandra Aparecida Silva

State University of Maringá, Avenida Colombo, Maringá 5790, Brazil

* Correspondence: Murilo Sabater da Silva Guerra, Email: sabatermurilo@gmail.com.

ABSTRACT

This study aimed to conduct a typological analysis of 100 dairy farms in rural settlements in Euclides da Cunha Paulista, São Paulo State, Brazil. Variables related to agroecological practices were used in cluster analysis. The following two groups were identified: Traditional extensive dairy farms (G1) and Modern sustainable dairy farms (G2). Socioeconomic, production, and agroecological variables were used in exploratory factor analysis, generating three factors/typological indicators. Factors were named production scale (F1), socioeconomic level (F2), and cow health, reproduction, and milking practices (F3). Production scale was the factor accounting for most of the variance in the dataset. Differences in indicator scores between dairy farm groups were assessed by the Mann–Whitney Utest (p < 0.05). The Modern sustainable dairy farm group had a larger production scale (p < 0.05), indicating that, among the analyzed systems, production capacity is associated with investment in more sustainable practices. There were no differences in scores for socioeconomic level or cow health, reproduction, and milking practices between groups (p > 0.05). Actions are necessary for the studied dairy farms to enhance their production capacity, particularly those comprising group Traditional extensive (59%), thereby maximizing their investment power and promoting the adoption of more sustainable management practices.

G Open Access

Received: 19 March 2024 Accepted: 29 May 2024 Published: 06 June 2024

Copyright © 2024 by the author(s). Licensee Hapres, London, United Kingdom. This is an open access article distributed under the terms and conditions of <u>Creative Commons Attribution</u> 4.0 International License. **KEYWORDS:** multivariate analysis; agroecology; dairy production systems; smallholder agriculture

ABBREVIATIONS

KMO, kaiser-meyer-olkim; TE, Traditional extensive; MS, Modern sustainable; L, liters

INTRODUCTION

The global agricultural sector is under pressure to increase production to meet the growing food demand while ensuring sustainability. Although agricultural production has intensified in recent years, some of the adopted practices have exacerbated environmental problems [1–3]. In this context of environmental and social challenges, world milk production is projected to grow at 1.6% per year until 2029. This rate is faster than that of other major agricultural products and is expected to be more expressive in low-income countries [4].

Brazil is a prominent milk producer, currently ranking third in milk volume in the global market, with about 36.5 million tonnes produced in 2020, behind the United States of America and India, which produced 101.2 and 87.82 billion tonnes of milk, respectively [5]. With such an expressive production volume, dairy farming contributes significantly to the economic development of the country. Dairy products represent an important share of the national agricultural market, with an annual growth of 2.43% between 2008 and 2016, above the world average [6].

Southern and southeastern Brazilian states concentrate a larger number of dairy farms and have higher milk yields. Nevertheless, dairy businesses are widespread throughout the entire country, albeit with large differences in production scale, characterizing a highly heterogeneous sector [7–9]. It should also be noted that dairy farms have nationwide importance, particularly family-based systems, owing to the positive impact they generate at the regional level [8]. Milk production often serves as the main income-generating activity in family farms, including in rural settlements created by the agrarian reform [10,11].

Although recent reports suggest an increase in production efficiency in Brazilian dairy farms, resulting in yield gains, milk production and yield values still fall short of those of other countries, such as the United States, Canada, and the Netherlands [12]. This increase in production volume can be attributed to intensification of dairy farming activities. However, this growth has brought about an increase in environmental impacts resulting from inadequate management practices, in addition to aggravating challenges related to animal health, animal welfare, and economic and social pressures, raising concerns about the long-term viability of milk production systems [13].

Among the practices that can effectively promote sustainability in production systems, one that takes center stage is agroecology. Agroecology is a scientific discipline that lays the methodological foundation for developing sustainable agricultural models and rural development strategies rooted in ecological principles [14]. Agroecological production models commonly rescue ancestral values and knowledge while also incorporating scientific and technological advances, thereby providing solutions for the production of pesticide-free, clean foods at any scale of production [15].

The development of agroecology has been accompanied by a broader adoption of ecologically based dairy farming. Ecological dairy farms are agrosystems that embrace sustainable practices, typically including the gradual introduction of ecological pasture management, increased forage diversity, afforestation, breeds adapted to local environmental conditions [16], pest and disease management programs potentially including phytotherapy and homeopathy [17], minimal use of agrochemicals, and reduced dependence on external resources. Furthermore, ecological production systems tend to offer better working conditions, enhancing social sustainability [18].

Several studies have reported the sustainability challenges faced by dairy farms, mostly related to environmental impacts, production costs, animal welfare, working conditions, income generation, and policy impacts [7,19,20]. A major challenge currently faced by agents operating in agricultural systems is to supply the population with agricultural products without causing environmental degradation or producing negative social and economic impacts. It is consensus that actions must be taken to foster the adoption of more sustainable practices. Studies carried out in Brazil showed that farmers' actions aimed at improving the economic, social, and environmental sustainability of dairy farms contribute to the long-term survival of the agribusiness [7,21].

Further research is needed to gain a more objective understanding of the diversity of Brazilian dairy farms and of which system components influence sustainability. Typological analysis has been applied in dairy research, including in the study of the Brazilian milk production sector [7,22]. In view of the low level of adoption of sustainable management practices in Brazilian dairy farms, this study aimed to conduct a typological analysis of dairy farms in rural settlements in Euclides da Cunha Paulista, São Paulo State, Brazil, based on ecological practices.

Our research questions are based on the following aspects: (a) do farmers who use agroecological practices have a structural, socioeconomic, and milking practice typology that is different from farmers who use conventional production practices? and (b) what are the main typological characteristics that distinguish farmers who use agroecological practices from those who do not? Based on these questions, three hypotheses were defined: h1: producers using agroecological practices have a larger scale structural typology compared to producers using conventional production practices; h2: farmers using agroecological practices have better socioeconomic typology results compared to farmers using conventional production practices; and h3: farmers using agroecological practices have better typology results related to milking practices compared to farmers using conventional production practices. Scientifically, the results of this research allow the analysis and discussion of the relationship between dairy systems using agroecological production practices and the characteristics of the typology of these systems and their rural farmers. In an applied sense, the results of this research could contribute to the creation of public and/or private strategies to strengthen dairy production towards sustainability.

MATERIALS AND METHODS

The study was conducted in Euclides Da Cunha Paulista, one of the 32 municipalities of a microregion known as Pontal do Paranapanema (between 20° and 24°S and 50° and 54°W), in the westernmost part of São Paulo State, Brazil (Figure 1). According to the Köppen and Geyser classification, the climate is tropical with a dry season (Aw), with an average temperature of 21.9 °C and mean annual rainfall of 1370 mm [23].

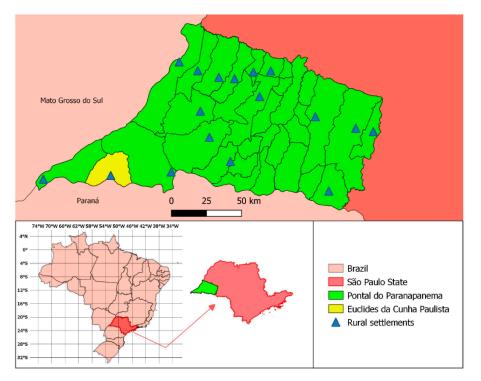


Figure 1. Location map of rural settlements in Euclides da Cunha Paulista and other municipalities of Pontal do Paranapanema, São Paulo State, Brazil. Source: the authors.

The region is characterized by very sandy, low-fertility soils that are easily carried by water when the protective vegetation is removed. There is a history of land appropriation and multiple conflicts related to unlawful land acquisition, with disputes between indigenous peoples, small squatters, and farmers, which led to intense degradation of native vegetation [24]. During this period, which became more intense from 1919, native forests underwent a dramatic reduction, and the landscape was altered by extensive cattle ranching and disorderly farming practices on heavily degraded soils, producing one of the most devastated regions in São Paulo State [25].

In the 1980s, with intensification of the Brazilian Agrarian Reform, several rural settlements were created in Pontal do Paranapanema. Currently, the region houses 6272 families in 117 settlements located in 17 municipalities as part of the National Agrarian Reform Program and the São Paulo State Public Plans for the Utilization and Valorization of Land Resources (Figure 1). Euclides da Cunha Paulista contains 10 rural settlements with the capacity for housing 653 families [26,27].

Over time, dairy farming became the primary economic activity of Pontal do Paranapanema rural settlements [28–30], attributed to the establishment of pastures on low-fertility soils even before settlements were created. Although these dairy farms have a low level of technological adoption and low yields, the activity serves as a reliable source of income, providing subsistence for families and contributing to their permanence on the land [29]. In these dairy systems, important technologies that could increase productivity and consequently profitability for these farmers, such as the artificial insemination of animals, the production of preserved fodder to offer at times of the year when there is a shortage of pasture, the provision of balanced feed according to the animal category, among other practices and technologies, are not often used. This is mainly due to the lack of financial resources to acquire and technical knowledge about the importance of using these technologies. Nevertheless, there are several challenges from the point of view of sustainability. Dairy farming in Pontal do Paranapanema was introduced to already-degraded pastures, depends greatly on external inputs, and is characterized by high production costs and low levels of technical knowledge [29]. Moreover, there are problems related to the inadequate adoption of conventional production practices, such as excessive use of agrochemicals and intense environmental degradation, resulting in soil erosion and contamination of natural resources [30].

Data Collection

Data collection was carried out on site by a single researcher. A total of 100 dairy farms in 10 rural settlements of Euclides da Cunha Paulista, São Paulo State, Brazil, were randomly selected and visited between June and November 2021. The survey was carried out with the dairy farmer—owner of the production system after they agreed to participate in the research. First, farmers were informed of the study objectives and were assured that participation was voluntary and all data collected were confidential. Semistructured questionnaires contained 31 questions divided into three sections, as follows: Section 1 (8 questions), socioeconomic variables; Section 2 (12 questions), technical and production variables; and Section 3 (11 questions), agroecological variables (Table 1). Responses were either metric or ordinal. For ordinal responses, scores ranged from 2 to 10 at 1point intervals. The highest score indicated the adoption of sustainable ecological or animal production practices, whereas the lowest score indicated a lack of adoption of sustainable practices. Several studies used ordinal responses for the quantification of practices or actions adopted in agricultural systems [31].

The variables analyzed in the current study were adapted from previous studies examining sustainability issues in dairy farming [7,22,32– 34]. The scores for each question were given by the farmers. No different scores or weights were assigned to any situation. The interviewer put the questions to the farmers, and they freely and spontaneously gave scores between 2 and 10 points. The score given by the farmer was recorded by the interviewer. After applying the form, the interviewer made observations of the facilities used by the farmer, which made it easier to conduct qualitative interviews in a more appropriate way.

Table 1. Socioeconomic, technical and production, and agroecological variables analyzed in the study.

Variable	Response type	Statistical analysis
Socioeconomic variables		
V1. Dairy farming experience (years)		
V2. Age of farm operator (years)	Metric	Factor analyzia
V3. Workforce size	Metric	Factor analysis
V4. Family workers (%)		
V5. Level of education of farm operator		
V6. Participation in farmers' groups	Ordinal	Factor analysis
V7. Sources of income (production diversification)	(2 to 10)	racion analysis
V8. Future perspectives		
Technical and production variables		
V9. Total farm size (ha)		
V10. Milk production area (ha)		
V11. Number of dairy cows		
V12. Number of cows in milk		
V13. Mean milk yield per cow (L cow ⁻¹ day ⁻¹)	Metric	Factor analysis
V14. Total daily milk yield (L day ⁻¹)		
V15. Mean annual yield per area (L year ⁻¹ ha ⁻¹)		
V16. Calving interval (months)		
V17. Annual number of mastitis		
V18. Milking process	Ordinal	
V19. Milking hygiene	(2 to 10)	Factor analysis
V20. Health and reproductive control	(2 (0 10)	
Agroecological variables		
V21. Soil management		
V22. Pesticide use		
V23. Fertilizer use		
V24. Pasture management		
V25. Forage species	Ordinal	
V26. Winter/dry season strategy	(2 to 10)	Cluster analysis
V27. Source of supplementary feed	(2 (0 10)	
V28. Water supply		
V29. Pasture afforestation		
V30. Medicine use		
V31. Waste management		
Source: [7,22,32–34].		

Data Analysis

The data were tabulated using Microsoft Office Excel and subsequently analyzed using Jamovi software version 1.8 [35] and R software version 4.0 [36]. The following statistical tests were applied: descriptive analysis, hierarchical cluster analysis, exploratory factor analysis, and tests of means to assess differences between farm groups.

Hierarchical cluster analysis was used to group farms according to ecological practices (V21 to V31, Table 1). This exploratory technique allows verifying the existence of similar behaviors among farms in relation to certain variables, identifying groups that are internally homogeneous and externally heterogeneous [37]. The model used for hierarchical clustering is given by equation (1).

$$d[k,(ij)] = max[d(k,i),d(k,j)]$$
(1)

This agglomerative algorithm calculates the shortest distance between elements *i* and *j* using the distance matrix d_{ij} . Agglomeration was performed using complete linkage and Euclidean squared distance metrics [38].

Exploratory factor analysis was used to identify correlations between variables and extract factors, or groups of interrelated variables, resulting in structural reduction of the dataset and generation of typological indicators (factors) [38]. Factors were extracted by principal component analysis with varimax rotation. The Kaiser-Meyer-Olkin (KMO) test and Bartlett's sphericity test were used to evaluate the suitability of the data for factor analysis. Variables with factor loadings greater than 0.5 were retained [38]. The exploratory factor analysis model is described in equations (2 to 7).

$$X_1 = a_{11} \times F_1 + a_{12} \times F_2 + \dots + a_{1m} \times F_m + e_p$$
(2)

$$X_2 = a_{21} \times F_1 + a_{22} \times F_2 + \dots + a_{2m} \times F_m + e_p$$
(3)

$$X_{p} = a_{p1} \times F_{1} + a_{p2} \times F_{2} + \dots + a_{pm} \times F_{m} + e_{p}$$
(4)

where X_p is the *p*-th score of the standardized variable (p = 1, 2, ..., m), F_m is the extracted factor, a_{pm} is the factor loading, and e_p is the error.

The factor score of each dairy farm was estimated by multiplying the standardized variable score by the corresponding factor score coefficient (equations (5 to 7)):

$$F_1 = d_{11} \times X_1 + d_{12} \times X_2 + \dots + d_{1j} \times X_{jp}$$
(5)

$$F_2 = d_{21} \times X_2 + d_{22} \times X_2 + \dots + d_{2j} \times X_{jp}$$
(6)

$$F_{j} = d_{j1} \times X_{1} + d_{j1} \times X_{2} + \dots + d_{jp} \times X_{jp}$$
(7)

where F_j is the *j*-th extracted factor, d_{jp} the factor score coefficient, and *p* the number of variables [38].

To define the typology factors, we used as input variables in the exploratory factor analysis those related to the socioeconomic and techno productive typology of the farmers (V1 to V20—Table 1).

Finally, dairy farm groups were subjected to typological analysis based on ecological practices. Typological analysis is used to identify specific practices of different groups. Normality was assessed by the Kolmogorov–Smirnov and Shapiro–Wilk tests and homogeneity of variance by Levene's test. As the data were found to be non-normally distributed, a non-parametric test (Mann–Whitney *U*-test, p < 0.05) was used [39].

RESULTS

The evaluated dairy farms were heterogeneous with regard to structural, production, and socioeconomic characteristics. The mean total farm size was 19.89 ± 9.40 ha, with 16.21 ± 9.16 ha being used for milk production (81% of the total area). The amount of land (81% of total area) dedicated for dairy production includes the land used for pasture and other crops needed to feed the dairy herd, such as corn production. The fact that most of the land is devoted to milk production indicates the economic dependence of the families on this activity (Table 2). This strong link was confirmed by the future perspective of participants: 97% of farmers had the intention of maintaining or increasing production. It is noteworthy that 51% of dairy farms performed at least one other activity, and 2% performed more than three economic activities. Other areas of the property (19% of total area) include permanent conservation areas such as forest and/or water sources and family living areas.

Regarding milk production, the total daily milk yield was $68.85 \pm 49.75 \text{ L}$ day⁻¹, and the average annual milk production per cow was as follows 2168.55 ± 727.85 L year⁻¹. The mean herd size was 19.39 ± 11.11 and the number of cows in milk was 9.65 ± 5.28 . The mean yield per cow was $7.11 \pm 2.39 \text{ L}$ day⁻¹ and the annual yield per area was $1716.84 \pm 1153.80 \text{ L}$ ha⁻¹ year⁻¹ (Table 2). Farm operators had a mean age of 50.96 years, with 20.23 years of experience in dairy farming (Table 2). During the study, it was observed that most of the herds were composed of crossbred dual-purpose animals and few producers bred specialized dairy cows. Among the most common crosses observed were those between Holstein, Girolando and Jersey animals and Nelore cattle. In addition, we observed that male animals were not kept on farms but were often sold to other farmers.

Variable	Min	Max	Mean	Standard deviation
Total farm size (ha)	7.00	50.00	19.89	9.40
Milk production area (ha)	2.50	45.00	16.21	9.16
Herd size (heads)	4.00	60.00	19.39	11.11
Number of cows in milk (heads)	2.00	30.00	9.65	5.28
Mean milk yield per cow (L cow ⁻¹ day ⁻¹)	3.00	15.00	7.11	2.39
Total daily milk yield (L day ⁻¹)	8.00	320.00	68.85	49.75
Mean milk yield per cow (L cow ⁻¹ year ⁻¹)	915	4575	2168.55	727.85
Mean annual yield per area (L year ⁻¹ ha ⁻¹)	472.35	7019.20	1716.84	1153.80
Age of farm operator (years)	22.00	77.00	50.96	11.42
Dairy farming experience (years)	1.00	55.00	20.23	10.85

Agroecological variables are presented in Table 3. In general, the mean scores were low, particularly those on waste management, forage species, source of supplementary feed, soil management, and medicine use. On the other hand, water supply, fertilizer use, and pesticide use had the highest means.

Variable	Min	Max	Mean	Standard deviation
Waste management	2	8	3.94	0.722
Forage species	2	8	3.66	1.208
Source of supplementary feed	2	8	3.94	1.347
Soil management	2	8	3.96	0.634
Pasture management	2	8	5.12	1.373
Winter/dry season strategy	2	10	5.74	1.813
Pasture afforestation	2	8	5.36	1.630
Water supply	4	10	7.76	1.640
Fertilizer use	2	10	6.60	3.345
Pesticide use	2	10	6.58	2.075
Medicine use	2	8	3.58	1.490

Table 3. Agroecological scores of dairy farms (*n* = 100) analyzed in the study.

The agroecological variables that formed the most consistent groups were waste management, forage species, source of supplementary feed, soil management, and pasture management. Dairy farms with similar characteristics with regard to these agroecological practices were grouped, differing from farms of the other group.

Hierarchical cluster analysis generated two groups. Group 1 was composed of 59 dairy farms (59%) and group 2 comprised 41 dairy farms (41%) (Table 3). Groups 1 and 2 differed (p < 0.05) in the following agroecological variables: waste management, forage species, source of supplementary feed, soil management, and pasture management. Nevertheless, both groups had low mean scores for agroecological variables, indicating little use of ecologically based practices (Table 4).

Table 4. Agroecological	scores of dairy farm	groups identified by l	hierarchical cluster analysis.

Variable	Group	n	Mean	Standard deviation	<i>p</i> -value
Waste management	TE	59	3.76 ^b	0.652	0.003
	MS	41	4.20 ^a	0.749	
Forage species	TE	59	3.08^{b}	1.005	< 0.001
	MS	41	4.49 ^a	0.978	
Source of supplementary feed	TE	59	3.63 ^b	1.202	0.008
	MS	41	4.39 ^a	1.430	
Soil management	TE	59	3.83 ^b	0.562	0.013
	MS	41	4.15 ^a	0.691	
Pasture management	TE	59	5.54^{b}	1.222	< 0.001
	MS	41	5.95 ^a	1.139	

TE, Traditional extensive dairy farms; MS, Modern sustainable dairy farms. ^{a,b} For each variable, means followed by different letters are significantly different at p < 0.05.

Group 2, consisting of 41% of the dairy farms, obtained higher scores on agroecological variables, indicating that these farmers adopt such practices more intensively, with a higher degree of sustainability. Therefore, the group was called Modern sustainable dairy farms. Group 1, consisting of 59% of the dairy farms, obtained lower mean scores on agroecological variables, thus being called Traditional extensive dairy farms.

No dairy farm performed adequate waste treatment, but, in 90% of cases, farms used solid waste for fertilization of forage crops and vegetable gardens. Almost all dairy farms (98%) performed soil tillage, even if sporadically.

Typological Indicators

The KMO value was 0.688 and Bartlett's test was significant (p < 0.05), indicating that the 10 variables used in this study were adequate for exploratory factor analysis [38]. Three factors had an eigenvalue greater than 1.0 and explained 67.3% of the variance in the dataset (Table 5).

Table 5. Variance explained.

Factor	Eigenvalue	% of variance	Cumulative %
Production scale	3.49	34.9	34.9
Socioeconomic level	1.75	17.5	52.4
Cow health, reproduction, and milking practices	1.49	14.9	67.3

Production scale includes the variables milk production area, herd size, farm size, number of cows in milk. Socioeconomic level includes the variables age, level of education, and dairy farming experience of farm operators. Cow health, reproduction, and milking practices includes the variables milking hygiene, health and reproductive management, and milking process.

Each factor was labeled according to the variables composing it. The factor labeled Production scale explained the largest amount of variance between dairy farms (34%). The factor was composed of the variables milk production area, herd size, farm size, and number of cows in milk (Table 5). These variables represent production capacity and may directly influence the success of the activity, associated with increased revenue and investment power.

The factor labeled Socioeconomic level, accounting for 17.5% of the variance in the dataset, was defined by age, education level, and dairy farming experience of the farm operator (Table 5). These variables define the knowledge, experience, and disposition of farmers, which may influence the actions and management practices adopted.

The factor labeled Cow health, reproduction, and milking practices was defined by the variables milking hygiene, health and reproductive management, and milking process (Table 5). This factor accounted for 14.69% of the variation in the dataset. The variables are associated with herd health, yield, and milk quality. Table 6 shows the factors, variables, and respective factor loadings.

Variable	Production	Socioeconomic	Cow health, reproduction,
	scale	level	and milking practices
Milk production area	0.911		
Herd size	0.896		
Farm size	0.874		
Number of cows in milk	0.869		
Age of farm operator		0.901	
Level of education of farm operator		-0.722	
Dairy farming experience		0.621	
Milking hygiene			0.827
Health and reproductive management			0.666
Milking process			0.532

Table 6. Factor loadings and variables included in each factor.

* Variables with factor loading > 0.5 were retained.

Typology of Dairy Farm Groups

Typological analysis of dairy farm groups revealed that groups Traditional extensive and Modern sustainable did not differ (p < 0.05) in socioeconomic level or cow health, reproduction, and milking practices. This result is an indication that we should reject hypotheses h2 and h3 of this research.

Group Modern sustainable obtained a higher score (p < 0.05) on production scale (Table 6). This result allows us to accept the hypothesis h1 defined in this research. Modern sustainable dairy farms, characterized by systems adopting agroecological practices more intensively, had greater production scale, whereas Traditional extensive farms were characterized by reduced production capacity and income generation, possibly resulting in lower investments in production area and herd (Table 7).

Factor	Group	Mean	Standard error	<i>p</i> -value
Production scale	TE	-0.1015 ^b	0.138	0.038
	MS	0.146 ^a	0.141	
Socioeconomic level	TE	0.0863 ^a	0.124	0.664
	MS	-0.124 ^a	0.167	
Cow health, reproduction, and milking practices	TE	- 0.0 744 ^a	0.138	0.080
	MS	0.107 ^a	0.142	

TE, Traditional extensive dairy farms; MS, Modern sustainable dairy farms. ^{a,b} For each factor, means followed by different letters are significantly different at p < 0.05.

Although groups did not differ significantly in socioeconomic level or cow health, reproduction, and milking practices, in general, the level of application of adequate management practices, technological resources, and education was low. Regarding level of education, 55% of farm operators had completed only elementary school.

DISCUSSION

The diversity in production characteristics among the dairy farms analyzed here indicates that farms are heterogeneous with regard to management practices, resulting in different production scales. Such differences were observed despite the fact that all participating farms were located in rural settlements and therefore had to comply with maximum area requirements. Heterogeneity is commonly observed in Brazilian dairy systems, as reported in several studies assessing farms with different production scales and sizes [7,40,41].

In the current study, dairy farms had a maximum total area of 50 ha and were family-run, with a predominance of family labor, being therefore classified as family farms. According to Brazilian legislation [42], a family farmer or family entrepreneur is someone who practices activities on a rural property with an area smaller than four tax modules, whose activity is family-run, with a predominance of family labor and a given percentage of the household income derived from the rural enterprise. The tax module [43] is expressed in hectares and varies according to municipality. It is determined by taking into account the type and income of the predominant agricultural activity of the locality, as well as the concept of "family property". In the municipality of Euclides da Cunha Paulista, São Paulo State, the tax module is 30 ha. Therefore, all dairy farms analyzed in the current study are classified as small rural properties [44].

Although family farming in Brazil is associated with food and nutritional security, given the close link between household and production environments, the limited production area may be seen as a structural problem, compromising the economic viability of dairy activity. Family farmers, in general, have low technology adoption, given the limited access to information, small workforce, inadequate infrastructure, and type of social organization. Therefore, it is crucial to seek alternatives to improve their production capacity and negotiating power [45]. Our results confirmed the low technological level of rural dairy farms.

Dairy farms had a mean total daily milk yield of 320 L day⁻¹, and 97% of farms did not exceed 200 L day⁻¹. As stated by Ferazza and Castellani [46], 92.6% of Brazilian dairy farms are small-scale, with a total milk yield of 200 L day⁻¹. The findings are in agreement with the typical herd characteristics of the study region, as analyzed by Pagani et al. [47]. The authors found that dairy farms of western São Paulo State generally have crossbred cattle with poor milk performance. Beef bulls are used for reproduction to allow complementary income from calf sales. Herds

Dairy production is directly influenced by production efficiency. Birth rate, animal longevity, number of replacement heifers, and genetic progress of the herd directly affect the productivity and profitability of the dairy activity. Thus, it is essential to monitor the reproductive and production characteristics of the herd and perform sanitary examinations to identify any reproductive problems and create strategies and interventions [49]. Dairy farms with better animal performance indices are associated with practices that promote production and reproductive potential, greater physical structure, increased feed autonomy, and higher production volumes [50]. Several studies on Brazilian dairy farms indicated that a larger production scale may translate into greater sustainability. High daily yield, yield per cow, yield per area, and herd size were associated with dairy systems that adopt practices to increase economic, social, and environmental sustainability, regardless of total farm size [7,21].

Group Modern sustainable (n = 41) scored higher on waste management, indicating that these farms apply solid waste for grass forage and pasture fertilization. According to Pegoraro [51], this practice is a critical point of internal biosecurity, as inadequate use of solid waste may lead to contamination of water, pasture, and hay. Other waste management alternatives include biogas and biofertilizer production, waste stabilization pond, composting, and manure processing.

Soil management is carried out more sustainably by group Modern sustainable. These farms till soil sporadically, whereas group Traditional extensive farms perform tillage intensively. Tillage practices, such as plowing, harrowing, and subsoiling, as well as pasture burning and continuous grazing, destroy soil structure and reduce organic matter content, causing compaction, compromising soil fauna, and leading to erosion and reduced fertility. These factors may generate dependence on agrochemicals [15].

Pasture management was performed more adequately by group Modern sustainable, indicating that they have a greater number of pasture divisions, affording better grazing control and higher forage yield and quality. However, none of the farms adopted Voisin rational grazing. According to Machado [52], Voisin rational grazing maximizes production by optimizing the pasture-animal-rotation interaction. This efficient method does not compromise environmental quality and improves soil fertility, reducing the need for machines, inputs, and labor, being essential for sustainable and ecologically friendly agriculture.

The extensive territory of Brazil and its tropical climate are favorable for the cultivation of grassy forages and legumes. Pastures are widely used as cattle feed, providing benefits from economic and environmental points of view. Pastures have low cost and high capacity to fix atmospheric carbon, provided that they are managed properly [53]. In this context, Voisin rational grazing is a viable management technique that meets current technical and environmental standards. It contributes to the regular, profitable production of fodder and enhances the generation of ecosystem services, such as soil carbon fixation, water retention, increased water quality and soil health, and stimulation of species biodiversity [12].

Non-adoption of Voisin rational grazing in the systems analyzed here, as well as in other regions of the country, is likely related to farm operators' resistance to changes and/or new techniques, difficulties in understanding and applying Voisin rational grazing laws, and perceptions of high costs and labor. Furthermore, farmers may consider conventional methods to be easier and methods that require low use of external inputs to be unfeasible, preferring conserved forage and refusing to build knowledge. Another factor may be the lack of specialized professionals for technical assistance and marketing strategies that encourage input acquisition and use [54].

Forage diversification was higher in group Modern sustainable. These farms likely intercrop forage species or plant different species in separate areas. In monoculture pastures, animal health may be negatively affected by low nutritional diversity. It is recommended to offer a mixture of tropical pastures or use paddocks with different forages and a variety of herbs. Short grasses are more suitable for dairy cattle, but legumes may be offered at a ratio of up to 30% [16].

English farmers reported that investments in pasture division, diversification of forage species, afforestation of grazing areas, and croplivestock integration afforded higher forage yield and quality, increased animal performance, and improved health and soil fertility, among other production and environmental gains. Some of the reported disadvantages were the need for initial investments in infrastructure, machinery, equipment, and inputs and negative reception of farmers according to their perspectives and values [55].

Group Modern sustainable scored higher on source of supplementary feed. This parameter is related to the adoption of feed strategies for the winter and drought periods, indicating reduced dependence on external feed. The most efficient way to overcome pasture deficit is to process and store surplus forage as hay or silage. Other options include direct grazing or harvest of grass forage and use of alternative feed free of contaminants [52]. Dairy farms that invest in nutritional management, making the most of strategic moments and pasture scarcity, are characterized by a greater production structure (production scale), with greater farm size, production area, herd size, and milk yield. Such practices, when associated with milking management and herd control, contribute to positive production results [56]. Typological analysis revealed that group Modern sustainable had greater production capacity, larger production area, and greater number of cows in milk. These farms were characterized by a more intensive use of sustainable management practices. Several studies showed that variables related to production scale can differentiate dairy systems in Brazil [41,57]. Factors promoting socioenvironmental and economic sustainability contribute to meeting institutional requirements for milk quality, enhancing bargaining power, autonomy, and production control, thereby contributing to long-term permanence in the activity [7,22,21].

Dairy farms with greater production capacity have good milking practices, higher milk quality, increased farmer knowledge, adequacy with environmental laws, and higher levels of social sustainability [7]. Dairy farms with greater production capacity also have more efficient financial management, with greater autonomy and production control [22]. These characteristics may contribute to increasing product volume and quality. Dairy farms that achieve high production volumes and yields are associated with environmental sustainability, being in accordance with Brazilian environmental legislation. These farms generally have adequate waste management; adopt practices that promote the preservation of water resources, flora, and fauna; use organic fertilizers; and maintain high soil and pasture quality [21].

Production gains and farm sustainability are influenced by farm operators' experience in the dairy activity and training. Older age and low education level can be barriers to the adoption of new technologies. Younger farmers tend to have greater control over financial management, as evidenced by the use of software [57]. Age group and education level may influence the decisions made by farm operators, reflecting on farm performance. Farmers with older age and low education levels tend to not meet current market and institutional requirements and are less likely to adopt production technologies [22,57–59].

A low education level may negatively affect milk volume and quality. Farmers who adopt adequate milking management and hygiene practices, such as individual registration of cows, produce higher-quality milk, complying with sanitary laws and promoting greater financial return [22,60]. Farmers who do not comply with sanitary laws have low chances of remaining in the dairy activity in the medium and long terms [40]. Therefore, participation in training programs to improve milk quality may contribute to increased production structure and scale, more knowledge about quality parameters, and adoption of adequate management techniques. Farms that meet such requirements often receive price bonuses for high milk quality [61].

Meeting institutional and market demands for milk production volume and quality results in a higher price paid per liter of milk. This factor may encourage farmers to invest in production capacity, workforce, and other related aspects [61], contributing to permanence in the activity [8,48]. Such investments may include training and education for agroecological transition toward more sustainable production systems. However, transformation of dairy farms into more resilient and sustainable systems does not depend solely on investment capacity; it is necessary to stimulate the replacement of inputs and adoption of more adequate management According Caporal [62], practices. to in light of current socioenvironmental and economic challenges, changes are necessary to guide and facilitate such a transition toward ecological and social sustainability. Rural outreach, particularly public outreach, efforts are fundamental for family farmers, who must reinvent themselves and participate actively aiming at agroecological practices.

Overall, group Modern sustainable dairy farms had greater feeding autonomy, with more effective pasture management and less external dependence on supplementary feed. These farms also adopted more adequate practices regarding solid waste and soil management. These characteristics are associated with greater investments in production structure, such as in total farm size and production area. This group of farmers may increase sustainability by intensifying and implementing new agroecological practices, such as Voisin rational grazing, forage diversification and intercropping, internal production of supplementary feed, and waste treatment/reuse, further reducing their external dependence on inputs. Group Traditional extensive farms should invest in production scale, production structure, and milk quality to increase their production and investment capacity, allowing progress in other aspects of the production system.

CONCLUSIONS

Dairy farms from rural settlements in Euclides Da Cunha Paulista, Pontal do Paranapanema, São Paulo State, Brazil, are characterized by low adoption of agroecological management practices. Nevertheless, dairy farms were found to be heterogeneous, differing in factors related to production scale.

Dairy farms with higher production capacity had greater adoption of agroecological practices. This finding indicates that a greater production volume, achieved via investments in more technically appropriate practices, is directly linked to sustainability, increasing the likelihood of permanence in the activity in the long term.

Actions are necessary for the studied dairy farms to enhance their production capacity, particularly those comprising group Traditional extensive (59%), thereby maximizing their investment power and promoting the adoption of more sustainable management practices. These necessary transformations, however, must be participatory and guided by agroecological principles, with the action of rural outreach efforts to facilitate and encourage transition.

As future research, we suggest adding questions about the genetic standard of the animals, animal welfare, the type of production system—extensive, semi-extensive or intensive, information and data on

nutritional aspects, among others—to the studies on sustainability in dairy production.

INFORMED CONSENT STATEMENT

Informed consent was obtained from all subjects involved in the study. Farmers agreed to participate in the survey on a voluntary basis. Data and information were anonymized and the farmers were not identified.

DATA AVAILABILITY

The dataset of the study is available from the authors upon reasonable request.

AUTHOR CONTRIBUTIONS

MSSG, FIB and AAS designed the study. MSSG performed the data collection. FIB analyzed the data. MSSG wrote the paper with input from all authors.

CONFLICTS OF INTEREST

The authors declare that there is no conflict of interest.

ACKNOWLEDGMENTS

We would like to thank the participating farmers for welcoming us into their homes and sharing their time and valuable experiences.

We would like to thank Conselho Nacional de Desenvolvimento Científico e Tecnológico—CNPq. Processo 303291/2021-4.

REFERENCES

- Baccar M, Bouaziz A, Dugué P, Gafsi M, Le Gal PY. The determining factors of farm sustainability in a context of growing agricultural intensification. Agroecol Sustain Food Syst. 2019;43(4):386-408.
- Kopittke PM, Menzies NW, Wang P, McKenna BA, Lombi E. Soil and the intensification of agriculture for global food security. Environ Int. 2019;132:105078.
- 3. McKenzie FC, Williams J. Sustainable food production: constraints, challenges and choices by 2050. Food Secur. 2015;7(2):221-33.
- 4. OECD, FAO. OECD-FAO Agricultural Outlook 2020–2029. Available from: https://www.oecd-ilibrary.org/docserver/1112c23b-en.pdf?expires=17169666 85&id=id&accname=guest&checksum=45C6D2E1CF6CA76106BBA63AFE9B87 E8. Accessed 2024 May 29.
- 5. Food and Agriculture Organization of the United Nations. Livestock Primary. Available from: <u>http://www.fao.org/faostat/en/#data/QL</u>. Accessed 2024 Mar 9.
- Companhia Nacional de Abastecimento. Compêndio de Estudos Conab: Pecuária leiteira: análise dos custos de produção e da rentabilidade nos anos de 2014 a 2017. Available from: <u>https://www.conab.gov.br/institucional/publi</u> <u>cacoes/compendio-de-estudos-da-conab/item/10548-compendio-de-estudos-</u>

da-conab-v-16-pecuaria-leiteira-analise-dos-custos. Accessed 2024 May 29.

- Bánkuti FI, Prizon RC, Damasceno JC, De Brito MM, Pozza MSS, Lima PGL. Farmers' actions toward sustainability: a typology of dairy farms according to sustainability indicators. Animal. 2020;14(S2):s417-23.
- 8. Bánkuti FI, Caldas MM. Geographical milk redistribution in Paraná State, Brazil: Consequences of institutional and market changes. J Rural Stud. 2018;64:63-72.
- Instituto Brasileiro de Geografia e Estatística. Censo Agropecuário 2017: Resultados Definitivos [2017 Agricultural Census: Definitive Results]. Available from: <u>https://biblioteca.ibge.gov.br/visualizacao/periodicos/3096/agro 2017 resultados definitivos.pdf</u>. Accessed 2024 Mar 9. Portuguese.
- Guerra MS da S, Bánkuti FI, Silva AA. Características dos Sistemas Produtivos Leiteiros dos assentamentos rurais do município de Euclides da Cunha Paulista/SP, região do Pontal do Paranapanema [Characteristics of Dairy Production Systems in rural settlements in the municipality of Euclides da Cunha Paulista/SP, Pontal do Paranapanema region]. Res Soc Dev. 2022;11(10):e263111032596-e263111032596. Portuguese.
- Marks Machado JTM, Dabdab Waquil P. Características Socioeconômicas e Produtivas da Pecuária Familiar Leiteira do Rio Grande do Sul [Socioeconomic and Productive Characteristics of Family Dairy Farming in Rio Grande do Sul]. Rev Grifos. 2022;31(57):01-25. Portuguese.
- Pinheiro Machado Filho LC, Seó HLS, Daros RR, Enriquez-Hidalgo D, Wendling AV, Pinheiro Machado LC. Voisin rational grazing as a sustainable alternative for livestock production. Animals. 2021;11(12):3494.
- Silva MF da, Gameiro AH. Indicadores de Sustentabilidade para a Produção de Leite: uma Revisão de Literatura [Sustainability Indicators for Milk Production: a Literature Review]. Rev Livre Sustentabilidade Empreendedorismo. 2021;6(5):208-37.
- Caporal FR, Costabeber JA. Agroecologia: alguns conceitos e princípios [Agroecology: some concepts and principles]. Available from: <u>https://www.researchgate.net/publication/238786482 Agroecologia alguns conceitos e principios</u>. Accessed 2024 May 29. Portuguese.
- Machado Filho LCP, Machado LCP. A dialética da agroecologia: Contribuição para um mundo com alimentos sem veneno [The dialectic of agroecology: Contribution to a world with poison-free food]. 2nd ed. São Paulo (Brazil): Expressão Popular; 2017. Portuguese.
- Primavesi A. Manejo ecológico de pastagens em regiões tropicais e subtropicais [Ecological management of pastures in tropical and subtropical regions]. 1st ed. São Paulo (Brazil): Expressão Popular; 2019. Portuguese.
- 17. Aparecida Balem T, Lopes Machado R. Sistemas De Produção De Leite De Base Ecológica: A Construção Das Variáveis a Partir De Uma Experiência De Extensão Rural Em Santa Maria-Rs [Ecologically Based Milk Production Systems: The Construction of Variables Based on a Rural Extension Experience in Santa Maria-Rs]. Rev Bras Agroecol. 2019;4(1):16-30. Portuguese.

- Duval JE, Blanchonnet A, Hostiou N. How agroecological farming practices reshape cattle farmers' working conditions. Agroecol Sustain Food Syst. 2021;45(10):1480-99.
- Segerkvist KA, Hansson H, Sonesson U, Gunnarsson S. Research on environmental, economic, and social sustainability in dairy farming: A systematic mapping of current literature. Sustainability. 2020;12(14):5502.
- Siqueira TTS, Galliano D, Nguyen G, Bánkuti FI. Organizational forms and agri-environmental practices: The case of brazilian dairy farms. Sustainability. 2021;13(7):3762
- 21. Gazola MG, Bánkuti FI, De Brito MM, Prizon RC, Kuwahara KC, Dos Santos Pozza MS, et al. Development and application of a sustainability assessment model for dairy production systems. Semin Agrar. 2018;39(6):2685-702.
- 22. Defante L, Damasceno JC, Bánkuti FI, de Oliveira Ramos CEC. Typology of dairy production systems that meet Brazilian standards for milk quality. Rev Bras Zootec. 2019;48:e20180023.
- 23. Peel MC, Finlayson BL, McMahon TA. Updated world map of the Köppen-Geiger climate classification. Hydrol Earth Syst Sci. 2007;11(5):1633-44.
- 24. Leite JF. A ocupação do Pontal do Paranapanema [The occupation of Pontal do Paranapanema]. São Paulo (Brazil): Hucitec; 1998. Portuguese.
- 25. Pilla A, Andrade MR, de Paula Marques LA. Fundação ITESP: sua história e realizações, evolução das políticas agrária e fundiária no estado de São Paulo [ITESP Foundation: its history and achievements, evolution of agrarian and land policies in the state of São Paulo]. São Paulo (Brazil): Fundação Itesp; 2013. Portuguese.
- INCRA IN de C e RA. Relação de Beneficiários [List of Beneficiaries]. Available from: <u>https://www.gov.br/incra/pt-br/assuntos/reforma-agraria/sr-08-sp.pdf</u>. Accessed 2024 Mar 10. Portuguese.
- 27. Instituto de Terras do Estado de São Paulo—ITESP. Assentamentos Rurais [Rural Settlements]. Available from: <u>https://www.itesp.sp.gov.br/?page id=</u> <u>3497</u>. Accessed 2024 Mar 10. Portuguese.
- Mazzini EJT, Martin ES, Fernandes BM. Assentamentos Rurais no Pontal do Paranapanema-SP: uma Política de Desenvolvimento Regional [Rural Settlements in Pontal do Paranapanema-SP: a Regional Development Policy]. Formação. 2007;1(14):56-66. Portuguese.
- 29. Silva MES, Barone LA, Izidoro LT. A Produção Leiteira em Assentamentos de Reforma Agrária: Renda, Organização e Resistência [Dairy Production in Agrarian Reform Settlements: Income, Organization and Resistance]. Retratos Assentamentos. 2011;14(1):265-82. Portuguese.
- 30. Urchei MA, Canuto JC, de Queiroga JL, Malagodi-Braga KS, Ramos Filho LO, Neves MC, et al. Construção do conhecimento e de tecnologias agroecológicas com os Agricultores Familiares do Pontal do Paranapanema [Construction of knowledge and agroecological technologies with Family Farmers from Pontal do Paranapanema]. Available from: <u>https://www.alice.cnptia.embrapa.br/</u> <u>alice/bitstream/doc/1011730/1/PT020.pdf</u>. Accessed 2024 May 29. Portuguese.

- 31. de Oliveira Sidinei MEA, Marcato SM, Perez HL, Bánkuti FI. Biosecurity, environmental sustainability, and typological characteristics of broiler farms in Paraná State, Brazil. Prev Vet Med. 2021;194:105426.
- 32. Kuwahara KC, Damasceno JC, Bánkuti FI, Prizon RC, Rossoni DF, Eckstein II. Sustainability and typology of dairy production systems. Semin Agrar. 2018;39(5):2081-92.
- 33. Munyaneza C, Kurwijila LR, Mdoe NSY, Baltenweck I, Twine EE. Identification of appropriate indicators for assessing sustainability of small-holder milk production systems in Tanzania. Sustain Prod Consum. 2019;19:141-60.
- 34. Nahed J, Gonzalez Pineda S, Grande D, Aguilar JR, Sánchez B, Ruiz Rojas JL, et al. Evaluating sustainability of conventional and organic dairy cattle production units in the Zoque Region of Chiapas, Mexico. Agroecol Sustain Food Syst. 2019;43(6):605-38.
- 35. Jamovi. Available from: <u>https://www.jamovi.org</u>. Accessed 2024 May 29.
- 36. Team RC. R: A Language and environment for statistical computing. Available from: <u>https://cran.r-project.org</u>. Accessed 2024 May 29.
- 37. Fávero LP, Belfiore P. Manual de Análises de Dados: Estatística e Modelagem Multivariada com Excel, SPSS e Stata [Data Analysis Manual: Statistics and Multivariate Modeling with Excel, SPSS and Stata]. 1st ed. Rio de Janeiro (Brazil): Elsevier; 2017. Portuguese.
- Hair JF, Black WC, Babin BJ, Anderson RE. Multivariate Data Analysis. 7th ed. Hoboken (US): Prentice Hall; 2009.
- 39. Field A. Descobrindo a estatística usando o SPSS [Discovering Statistics Using SPSS]. 2nd ed. Porto Alegre (Brazil): Artmed; 2009. Portuguese.
- 40. Casali M, De Mendonça BS, De Brito MM, Rojas Dos Santos MG, Loesia Lima PG, Da Silva Siqueira TT, et al. Information asymmetry among dairy producers in Paraná, Brazil. Semin Agrar. 2020;41(1):293-304.
- 41. de Mendonça BS, Bánkuti FI, Pozza MSDS, Perez HL, Siqueira TT S. A typology of corporate and family dairy farms in eastern Goiás, Brazil. Cienc Rural. 2020;50(10): e20190285.
- 42. Lei no. 11.326, 24 Jul 2006 [Law no. 11,326, 24 Jul 2006]. Available from: https://www.planalto.gov.br/ccivil 03/ Ato2004-2006/2006/Lei/L11326.htm. Accessed 2024 Mar 10. Portuguese.
- Lei no. 4.504, 30 Nov 1964 [Law no. 4,504, 30 Nov 1964]. Available from: https://www.planalto.gov.br/ccivil_03/leis/l4504.htm. Accessed 2024 Mar 10. Portuguese.
- Lei no. 8.629, 25 Fev 1993 [Law no. 8,629, 25 Feb 1993]. Available from: https://www.planalto.gov.br/ccivil_03/LEIS/L8629.htm. Accessed 2024 Mar 10. Portuguese.
- 45. Bittencourt DMC. Estratégias para a agricultura familiar: visão de futuro rumo à inovação [Strategies for family farming: future vision towards innovation]. Brasília (Brazil): Embrapa; 2020. Portuguese.
- 46. de Andrade Ferrazza R, Castellani E. Analysis of Brazilian livestock transformations: a focus on dairy farming. Cienc Anim Bras. 2022;22:e68940.

- 47. Pagani Netto C, Fontes JL, Pimentel JCC, Martins SE. Mais Leite, Mais Renda— Plano de Desenvolvimento da Bovinocultura Leiteira Paulista [More Milk, More Income—São Paulo Dairy Cattle Farming Development Plan]. Campinas (Brazil): CATI; 2017. Portuguese.
- 48. Costa VDV, Martinelli RR, Bánkuti FI. A Typological Analysis of Dairy Farms Based on Bulk Milk Price. Trop Anim Sci J. 2022;45(3):374-80.
- Bergamaschi MAC, Machado R, Barbosa RT. Eficiência reprodutiva das vacas leiteiras [Reproductive efficiency of dairy cows]. São Carlos (Brazil): Embrapa; 2010. Portuguese.
- 50. Lange MJ, Zambom MA, De Oliveira Ramos CEC, Castagnara DD, Bánkuti FI, Neumann ME, et al. Typology of dairy production systems based on the characteristics of management in the Region of West Paraná. Semin Agrar. 2016;37(1):473-81.
- 51. Pegoraro LMC, Souza GN, Pradieé J, Weissheimer CF, Dereti RM, Viegas DP, et al. Medidas de biosseguridade—interna e externa [Biosecurity measures internal and external]. In: Pegoraro LMC, editor. Biosseguridade na Bovinocultura Leiteira [Biosecurity in Dairy Cattle Farming]. 1st ed. Pelotas (Brazil): Embrapa Clima Temperado; 2018. p. 28-43. Portuguese.
- Machado LCP. Pastoreio Racional Voisin: Tecnologia Agroecológica para o 3° Milênio [Voisin Rational Grazing: Agroecological Technology for the 3rd Millennium]. 3rd ed. São Paulo (Brazil): Expressão Popular; 2013. Portuguese.
- 53. Pereira AV, de Miranda Gomide CA, Paciullo DSC, Machado JC. Pastagens impulsionam pecuária de leite no Brasil [Pastures boost dairy farming in Brazil]. Available from: <u>https://ainfo.cnptia.embrapa.br/digital/bitstream/ doc/1143717/1/Pastagens-impulsionam-pecuaria-leite-Brasil.pdf</u>. Accessed 2024 May 29. Portuguese.
- 54. Leopoldino da Silva AW, Capeletto C. Dificuldades para a expansão do Pastoreio Racional Voisin, segundo a percepção de extensionistas rurais catarinenses [Difficulties in expanding Voisin Rational Pastoring, according to the perception of rural extension agents in Santa Catarina]. Rev Bras Agropecuária Sustentável. 2022;12(1):87-97. Portuguese.
- 55. Jordon MW, Winter DM, Petrokofsky G. Advantages, disadvantages, and reasons for non-adoption of rotational grazing, herbal leys, trees on farms and ley-arable rotations on English livestock farms. Agroecol Sustain Food Syst. 2023;47(3):330-54.
- 56. Tramontini RCM, Bánkuti FI, Pozza MSS, Massuda EM, Damasceno JC, Dias AM, et al. Typology of Dairy Production Systems Based on Management Strategies in Paraná State, Brazil. Trop Anim Sci J. 2021;44(1):123-30.
- 57. Zimpel R, Bánkuti FI, Zambom MA, Kuwahara KC, Bánkuti SMS. Characteristics of the dairy farmers who perform financial management in Paraná State, Brazil. Rev Bras Zootec. 2017;46(5):421-8.
- Hyland JJ, Heanue K, McKillop J, Micha E. Factors influencing dairy farmers' adoption of best management grazing practices. Land Use Policy. 2018;78:562-71.

- 59. Sauer J, Latacz-Lohmann U. Investment, technical change and efficiency: Empirical evidence from German dairy production. Eur Rev Agric Econ. 2015;42(1):151-75.
- 60. Vieira RKR, Rodrigues M, Santos PKS, Medeiros NBC, Cândido EP, Nunes-Rodrigues MD. The effects of implementing management practices on somatic cell count levels in bovine milk. Animal. 2021;15(4):100177.
- 61. Monteiro CS, Bánkuti FI, Martinelli RR, Lima PGL, Mendonça BS, Santos MGR. Incentives and typology of dairy production systems that participate in programs to improve milk quality. Available from: <u>https://periodicos.unicesumar.edu.br/index.php/rama/article/view/7774</u>. Accessed 2024 May 29.
- 62. Caporal FR. Transição Agroecológica e o papel da Extensão Rural [Agroecological Transition and the role of Rural Extension]. Ext Rural. 2020;27(3):7-19.

How to cite this article:

Guerra MSS, Bánkuti FI, Silva AA. Agroecological Practices and the Typology of Milk Production Systems in Brazilian Rural Settlements. J Sustain Res. 2024;6(2):e240027. <u>https://doi.org/10.20900/jsr20240027</u>