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Carbon footprint, non-renewable energy and land use of dual-purpose cattle systems in Colombia using a life cycle assessment approach

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1 **Carbon footprint, non-renewable energy and land use of dual-purpose cattle systems in Colombia using a**
2 **life cycle assessment approach**

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23 **Abstract**

24 Dual-purpose cattle systems (DPS) include more than 75% of all dairy cows in Latin America and produce 40%
25 of total milk production. Colombia has the fourth largest cattle herd in Latin America, and DPS account for
26 39% of the cattle population, and 58% of national milk production. Therefore, focusing on reducing the
27 carbon footprint of DPS can have a huge contribution on mitigating the environmental impacts of the cattle
28 farming sector. The present study aimed to estimate, based on a farm gate life cycle assessment (LCA)
29 approach, the environmental impact of 1313 dual-purpose farms in Colombia. The study also aimed at
30 identifying the main hotspots of negative environmental impacts and proposing possible mitigation options
31 and their cost-effectiveness. The impact categories such as carbon footprint (CF), non-renewable energy use,
32 and land use were estimated using the 2019 Refinement to 2006 IPCC, databases, and locally estimated
33 emission factors. Three methods of allocating environmental burdens to meat and milk products were
34 applied. A principal component multivariate analysis (PCA) and a Hierarchical Clustering on Principal
35 Components (HCPC) were performed. The largest source of GHG in dual-purpose cattle systems comes
36 directly from enteric fermentation, and manure deposited on pasture. The proportion of environmental
37 burdens allocated to meat differed, with the economic method assigning the greater burden (36%), followed
38 by energy content (30%) and mass production (13%). Four farms clusters and two production strategies were
39 identified, a more intensive strategy with high proportion of improved pastures and higher fertilizer
40 application rates (Clusters 1 and 2), and a more extensive with low input of fertilizers and grazing on natural
41 pastures (Clusters 3 and 4). Carbon footprint (CF) values ranged between 2.2 and 4.4 kgCO₂-eq per kg fat and

42 protein corrected milk (FPCM) and between 9.5 and 19.5 kgCO₂-eq per kg meat among clusters. CF, land use,
43 and non-renewable energy use were lowest for clusters 1 and 3. Concerning cost-effectiveness, the adoption
44 of improved pastures is a negative-cost measure and a promising climate change mitigation option. Overall,
45 the CF could be reduced by around 25 to 48% for milk and meat. Therefore, our results suggest that it is
46 possible to reduce GHG emissions by adopting improved pastures, better agricultural management practices,
47 efficient fertilizer usage, and using the optimal stocking rate. It is expected that these reductions can be
48 achieved with at negative costs.

49 Keywords: Colombian cattle systems; environmental impact; global warming potential, greenhouse gases
50 (GHG); livestock production systems; Mitigation

51 1. Introduction

52 By 2050, the global demand for animal products is expected to increase by more than 70% compared to the
53 demand in the year 2010, due to accelerated population growth and increased individual incomes.
54 Consequently, the livestock sector should increase production levels to satisfy the demand increase (Steinfeld
55 et al., 2006). Yet, increasing production levels following a business as usual (BAU) approach would lead to
56 increased greenhouse gas (GHG) emissions and greater use of natural resources. Therefore, livestock
57 producers must adopt cost-effective and climate-friendly practices to increase their productivity, while also
58 reducing their negative environmental impacts.

59 Dual-purpose cattle systems (DPS) constitute more than 75% of all dairy cows in Latin America, and are
60 responsible for 40% of total milk production (Rivas and Holmann, 2002). DPS are defined as cattle production
61 systems where the objective of the farmer is to derive economic benefits from the sale of both milk and
62 meat. Specifically, cows are partially milked, and the residual milk is consumed by their calves (Rojo-Rubio
63 et al., 2009). In Latin America, DPS based on extensive grazing systems, where the herd of cattle are
64 maintained exclusively on pastures, with little or no use of external inputs. Consequently, production levels
65 are low in comparison to specialized dairy systems (González-Quintero et al., 2020).

66 Colombia has the fourth largest cattle herd in Latin America (FAO, 2013), which in 2019 was comprised of
67 27.3 million heads with an annual milk and beef production of 7.3 million liters and 933 million kg,
68 respectively (FEDEGAN, 2019). In Colombia, DPS account for 35% of the cattle population, and 58% of
69 national milk production of the regular market. Most of the Colombian DPS farms are characterized by large
70 natural open pastures, using low amounts of inputs and having low milk production per lactation (3.5 L cow⁻¹
71 day⁻¹) (Carulla and Ortega, 2016; González-Quintero et al., 2020).

72 The Colombian government is committed to reduce the national GHG emissions by 20% from the national
73 BAU scenario between the baseline year 2010 and the year 2030 (Gobierno de Colombia, 2015). This goal
74 has underscored the need for implementing mitigation actions focusing on the productive sectors that
75 contribute a large proportion of the GHG emissions. In Colombia, agriculture is responsible for 26% of
76 national GHG emissions, and ruminant enteric fermentation contributes more than 31% of the GHG
77 emissions attributed to the agriculture sector (IDEAM et al., 2016). Therefore, mitigation efforts to effectively
78 reduce GHG emissions and meet the set targets should, inevitably, consider the Colombian cattle production
79 sector.

80 Life cycle assessment (LCA) allows for the compilation and appraisal of inputs, outputs and potential
81 environmental impacts of a product throughout its life from cradle to farm gate or to grave (Guinée, 2002).
82 Worldwide, several studies have used the LCA methodology for the integral assessment of the environmental
83 impacts and the identification of hotspots as well as enabling the identification of mitigation options for the
84 activities with the higher impacts (Cardoso et al., 2016; Oishi et al., 2013; Rotz et al., 2016; Sejian et al., 2018;
85 Styles and Jones, 2008; Thomassen et al., 2008b; Weiler et al., 2014). However, there are no studies that
86 have evaluated the environmental performance of the Colombian DPS especially with data collected directly
87 from producers, and in the Latin American region, studies that have assessed the carbon footprint of DPS are
88 few (Gaitán et al., 2016; Mazzetto et al., 2020). To our knowledge, this study uses the largest number of farms
89 for LCA's in DPS, dairy and beef systems in the world. The general lack of comprehensive studies makes it
90 difficult to establish appropriate GHG mitigation actions for the DPS. Such comprehensive studies would

91 inform the development of more sustainable livestock farming systems and contribute to the
92 accomplishment of national GHG emission reduction targets.

93 The present study aims to (1) estimate the environmental impact of dual-purpose farms quantified based on
94 GHG emissions, non-renewable energy use, and land use (LU), using a farm gate LCA approach with data
95 gathered directly from the farms in Colombia; and (2) to identify the main hotspots of negative
96 environmental impacts; and propose possible mitigation options and their cost-effectiveness.

97 2. Materials and methods

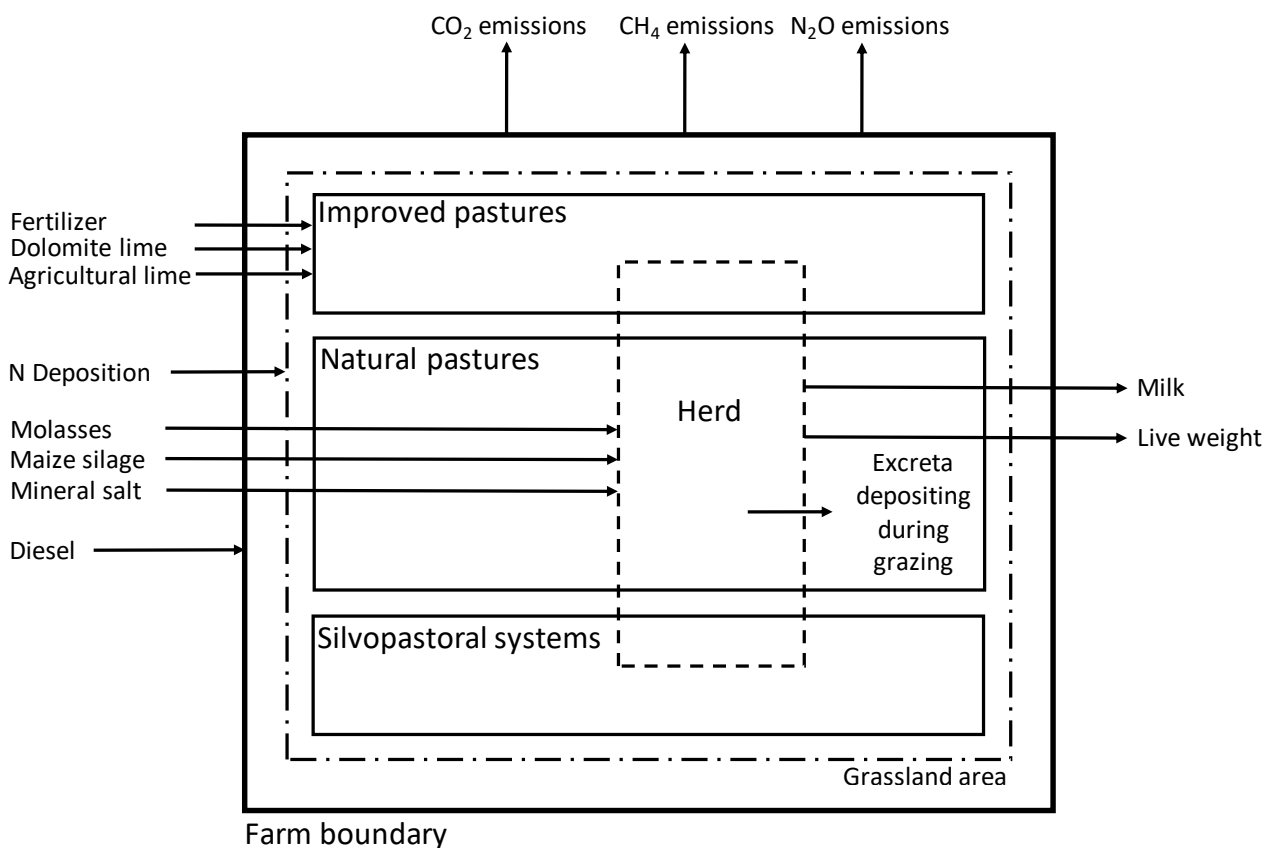
98 2.1 Life cycle assessment approach

99 A LCA approach was used to assess the carbon footprint (CF; GHG emissions per kg product), non-renewable
100 energy use, and land use of DPS in Colombia. The LCA was done by the attributional method, which aims to
101 quantify the environmental impact of the main co-products of a system in a status quo situation (Thomassen
102 et al., 2008a). The publicly available specification (PAS, 2050: 2011) (BSI and Carbon Trust, 2011) was used,
103 which is based on LCA and allows the quantification of GHG emissions in the life cycle of products. Modelling
104 was done with Microsoft Excel. For estimating CF, global warming potentials for a time-frame of 100 years
105 were used: 28 for methane; 265 for nitrous oxide; and 1 for carbon dioxide (IPCC, 2014).

106 2.1.1 Goal and Scope

107 2.1.1.1 System boundary definition

108 The system boundary was defined by the environmental impacts related to the DPS in a “cradle to farm-gate”
109 perspective (Figure 1). The direct or primary emissions are those generated within the farm system (on-farm)
110 and the secondary (off-farm) emissions are those upstream emissions related to the production and
111 transport of imported resources such as feed, fertilizer, and amendments to soils (BSI and Carbon Trust,
112 2011).



113

114 **Figure 1. System boundaries and flows accounted for in the estimation of the impact categories in the DPS**
115 **in a “cradle to farm-gate” approach**

116 2.1.1.2 Functional unit and allocation

117 The functional units used were 1 kg fat and protein corrected milk (FPCM) and 1 kg live weight gain (LWG)
 118 leaving the farm gate.

119 When a process produces more than one output, the environmental burden must be assigned between those
 120 outputs based on an allocation method (BSI and Carbon Trust, 2011). To divide the environmental burden
 121 between milk and meat three methods were used (Rice et al., 2017):

- 122 a) Economic allocation that was based on the price per kg and the total amount of milk (FPCM) and
 123 meat (LWG) produced per year.
- 124 b) Energy allocation that was based on the energy content (MJ) and the total amount of milk (FPCM)
 125 and meat (LWG) produced per year.
- 126 c) Mass allocation was based on the quantity of milk (FPCM) and live weight gain (LWG) produced per
 127 year.

128 *2.1.2 Life Cycle Inventory and impact assessment*

129 *2.1.2.1 Farm data*

130 The present study includes data collected by using surveys conducted on 1313 farms located in 13
 131 Departments within Colombia. The data represent one calendar year and were collected during the period
 132 2014 to 2015 by 2 projects: Ganadería Colombiana Sostenible and LivestockPlus. The criteria used to select
 133 these farms, the information included in the surveys, the main characteristics of farms, and the description
 134 of the study area were specifically described by González-Quintero et al. (González-Quintero et al., 2020).

135 Milk production was standardized to fat (3.7%) and protein (3.3%) corrected milk (FPCM) (Carulla and Ortega,
 136 2016). Live weight gain (LWG) was quantified as weight (kg) of animals produced from the farm, assuming no
 137 change in size of stock on the farm and no animals bought into the farm. Gross energy concentration was
 138 calculated from daily gross energy (GE) intake estimated for each animal category based on diet digestibility
 139 and daily net energy requirements for maintenance, activity, growth, lactation, and pregnancy. Dry matter
 140 intake (DMI) was computed by dividing herd specific gross energy intake values by the energy density of the
 141 feed (18.45 MJ per kg DM)(IPCC, 2019). Pasture productivity (t DM ha⁻¹ yr⁻¹) and nutrient content and
 142 digestibility (%) were estimated based on (i) the region and municipality where the farm was located into the
 143 country, (ii) the identification of the main types of pastures for each region by using the atlas of bovine
 144 production systems in Colombia (Pulido-Herrera et al., 2005), and (iii) expert criteria. Use of fertilizer and
 145 lime was expressed as the amount applied over an area (ha) of improved pasture.

146 The average and the 5th, 25th, 50th, 75th and 95th percentiles of the variables used to describe the farms are
 147 presented in Table 1.

148 **Table 1**

149 Farm characteristics based on the 1313 farms located 13 states in Colombia.

	Dual-purpose cattle farms (n = 1313)					
	Mean	5th percentile	25th	50th	75th	95th
<i>Herd, number of animals</i>						
Cows	25	2	5	12	26	85
Female calves (0-1 year)	8	0	1	4	8	26
Male calves (0-1 year)	7	0	1	3	7	25
Female calves (1-2 year)	6	0	0	1	6	30
Male calves (1-2 year)	5	0	0	0	3	21
Heifers (2-3 years)	6	0	0	1	6	29
Steers (2-3 years)	2	0	0	0	0	10
Bulls, no	1	0	0	1	2	4
Male and female calves less 1 yr + heifers (1-3 yr) + Young bulls (1-3 yr), no per cow	2	0	1	1.3	2	4
FPCM ^a , kg cow ⁻¹ year ⁻¹	1316	571	1028	1199	1570	2385
Live weight gain, kg AU ^{-1(b)} year ⁻¹	101	50	72	93	120	181
Molasses, kg AU ⁻¹ yr ⁻¹	96	0	0	131	172	196
Maize silage, kg AU ⁻¹ yr ⁻¹	88	0	0	0	201	256

Mineral salt, kg AU ⁻¹ yr ⁻¹	31	0	31	33	35	39
Gross energy, MJ day ⁻¹ AU ⁻¹	225.1	159.8	196.0	222.2	250.8	301.3
Dry matter intake, T AU ⁻¹ yr ⁻¹	4.4	3.2	3.9	4.4	5.0	6.0
Land						
Area, ha	45	4	8	16	39	181
Improved pastures, % of area	22.0%	0.0%	0.0%	0.0%	42.3%	93.0%
Silvopastoral systems, % of area	0.31%	0%	0%	0%	0%	0%
Natural pastures, % of area	77.7%	6.9%	57.1%	100%	100%	100%
For improved pastures						
Fertilizer ^c , kg ha ⁻¹ yr ⁻¹	156	25	119	119.32	180.23	350
Dolomite lime, kg ha ⁻¹ yr ⁻¹	315	25	25	150	350	1500
Agricultural lime, kg ha ⁻¹ yr ⁻¹	209	25	25	75	250	750
Production of pasture, T DM ha ⁻¹ yr ⁻¹	9.9	8.0	8.0	8.0	11.5	14.6
Farm						
Stocking rate, AU ha ⁻¹	1.44	0.26	0.65	1.18	2.05	3.41
Diesel, L ha ⁻¹ yr ⁻¹	1.42	0.13	0.50	1.02	1.89	3.79

^a FPCM: Fat Protein Corrected Milk (3.7% fat, 3.3% protein)

^b AU: Animal Unit (1 AU being either 1 cow, or 3.3 female and male calves less than 1 year, or 1.7 female and male calves 1 - 2 yr, or 1.3 heifers 2-3 yr, or 1.3 steers 1- 2 yr, or 0.8 bulls)

^c Fertilizer: 31(N): 8(P): 8(K)

150 2.1.2.2 Estimation of on-farm and off-farm emissions

151 Estimations of primary and secondary emissions were performed on an annual basis using 2019 Refinement
 152 to 2006 IPCC (IPCC, 2019). Equations and emission factors (EF) used for the estimation of the primary
 153 emissions of CH₄ and N₂O for each pollutant are summarized in Table 2.

154

155 **Table 2**
 156 Emission factors (EF) for estimation of on – farm emission from dual-purpose farms

Pollutant	Source	Amount	Reference
CH ₄	Enteric	$CH_4 = [GE \times (Y_m/100) \times 365]/55.65$ $GE = [(NE_m + NE_a + NE_l + NE_p/REM) + (NE_g/REG)]/(DE\%/100)$	Equation 10.21 in IPCC (Gavrilova et al., 2019) Equation 10.16 in IPCC (Gavrilova et al., 2019)
	Manure pasture	$Y_m: 0.07$ $CH_4 = VS \times B_0 \times 0.67 \times MCF/100 \times MS$ $VS = [GE \times (1 - DE/100) + (UE \times GE)] \times [(1 - Ash)/18.45]$	(IPCC, 2019) Equation 10.23 in IPCC (Gavrilova et al., 2019) Equation 10.24 in IPCC (Gavrilova et al., 2019)
N ₂ O-N direct	Pasture (excretions and fertilizer)	$DE: \text{feed digestibility}$ $MCF \text{ pasture}: 0.47$ $B_0: 0.19$ $N_2O-N = (F_{SN} \times EF_1) + (N_{ex} \times EF_{3PRP, CPP})$	(Gavrilova et al., 2019) (Gavrilova et al., 2019) Equation 11.1 in IPCC (Gavrilova et al., 2019)
		$EF_1: 0.01$ $EF_{3PRP, CPP}: 0.004$ $N_{ex} = N_{intake} - N_{retention}$ $N_{intake}: DMI \times (CP\%/100/6.25)$ $N_{retention}: [(Milk \times (Milk \text{ PR}\%/100)/6.38] + \{WG \times [268 - (7.03 \times Neg/WG)]/(1000 \times 6.25)\}$ $\text{Milk PR}\%: [1.9 + 0.4 \times \%Fat]$	Table 11.1 in IPCC (Gavrilova et al., 2019) Table 11.1 in IPCC (Gavrilova et al., 2019) Equation 10.31 in IPCC (Gavrilova et al., 2019) Equation 10.32 in IPCC (Gavrilova et al., 2019) Equation 10.33 in IPCC (Gavrilova et al., 2019)
N ₂ O-N indirect	Pasture (From NH ₃)	$N_2O-N = [(F_{SN} \times \text{Frac}_{GASF}) + (F_{PRP} \times \text{Frac}_{GASM})] \times EF_4$ $\text{Frac}_{GASF} \text{ Ammonium-based}: 0.08 (0.02 - 0.3)$ $\text{Frac}_{GASM}: 0.21 (0.00 - 0.31)$ $EF_4: 0.01 (0.002 - 0.05)$	Equation 11.9 in IPCC (Gavrilova et al., 2019) Table 11.3 in IPCC (Gavrilova et al., 2019) Table 11.3 in IPCC (Gavrilova et al., 2019) Table 11.3 in IPCC (Gavrilova et al., 2019)
CO ₂ -C direct	Lime application	$CO_2-C = (M_{Limestone} \times EF_{Limestone}) + (M_{Dolomite} \times EF_{Dolomite})$	Equation 11.12 in IPCC (Gavrilova et al., 2019)

Diesel fuel consumption

EF_{Limestone}: 0.12

EF_{Dolomite}: 0.13

CO₂-C = Fuel consumption x EF_{Diesel}

EF_{Diesel}: 2.23 kg CO₂eq L⁻¹ diesel⁻¹

UPME (2016)

158

159 The amount of organic dry matter in manure was calculated from the herd specific gross energy intake;
 160 digestibility of feed consumed; default values for ash content in dry matter and CH₄ producing capacity; and
 161 the methane conversion factor.

162 A nitrogen balance at farm level was made to check for possible N surplus and thus risk of N leaching. For
 163 each farm, surplus of N was quantified and expressed in kilogram N applied per ha. N input was estimated
 164 by multiplying the amount of each input purchased by its percent N content. Annual N deposition was
 165 assumed by a standard (15 kg N ha⁻¹) (Bobbink et al., 2010), and N fixation was set as zero. The N outputs
 166 were estimated by multiplying the amount of milk and live weight produced by their N content. The
 167 difference between the N surplus at farm level and the N lost by gaseous emissions was too low for most of
 168 farms, therefore, N loss from manure and N fertilizers through leaching of the N was assumed to be negligible.
 169 Emissions from livestock respiration (Steinfeld et al., 2006) and the variation in soil carbon stocks at farm
 170 level were not taken into account.

171 Emission factors (EF) used for the estimation of the secondary emissions from imported feeds and fertilizers
 172 are summarized in Table 3. These GHG emissions corresponded to production and transport of these
 173 agricultural inputs.

174 **Table 3**

175 Estimation of off-farm emissions, energy use, and land use for dual-purpose-farms

Input	GWP (kgCO ₂ eq kg ⁻¹ input)	Energy demand (MJ kg ⁻¹ input)	Land use (m ² kg ⁻¹ input)
Synthetic nitrogen fertilizer			
N ^a	6.6	43.6	---
P ^b	3.6	55.7	---
K ^b	0.7	8.1	---
Lime ^a	0.03	0.7	---
Maize silage ^b	0.0762	0.963	0.237
Mineral salt ^c	0.155	1.92	---
Molasses ^a	0.871	4.36	0.584
Transport ^b	254*	3.62**	---

^aAgri-footprint, 2015

^bEcoinvent 3, 2013

^cELCD: European Life Cycle Database

* kgCO₂ eq t⁻¹ km⁻¹; ** Mj t⁻¹ km⁻¹

176 *2.1.2.3 Non-renewable energy use and land use*

177 Energy used for consumption of fossil fuels on-farm and transportation of inputs from factory to farm, were
 178 calculated according to the Planning Unit of the Mines and Energy of Colombia (UPME, 2016), and the
 179 Ecoinvent database (Weidema et al., 2013). Off-farm energy requirements related to the production of
 180 agricultural inputs were estimated by using specific factors obtained from Agri-Footprint, Ecoinvent, and
 181 European Life Cycle Reference Databases (Durlinger et al., 2014; Weidema et al., 2013) as shown in Table 3.

182 The land use was calculated as the sum of the on-farm grazing area, and the area off-farm required to
 183 produce the purchased feeds. The grazing area was obtained from the surveys of each farm, and the off-farm
 184 area from Agri-Footprint database and Ecoinvent database as shown in Table 3.

185 *2.2 Statistical Analyses*

186 Results are presented as means, minimum and maximum values. A principal component multivariate analysis
 187 (PCA) was performed with the PCA procedure from the FactoMineR package (Husson et al., 2015). This shows
 188 relationships among total environmental impacts (CF, land use, and non-renewable energy use) per kilogram

189 FPCM and kilogram LWG resulted from economic allocation, and several quantitative variables (kg FPCM cow⁻¹
190 year⁻¹; kg FPCM ha⁻¹ year⁻¹, kg LWG⁻¹ year⁻¹ ; kg LWG ha⁻¹ year⁻¹, stocking rate, % of area under improved
191 pastures, kg fertilizer ha⁻¹ yr⁻¹, feed purchased as % of DMI, T forage production DM ha⁻¹ yr⁻¹, and L diesel
192 consumption ha⁻¹ year⁻¹). To perform a numerical classification of farms, a Hierarchical Clustering on Principal
193 Components (HCPC) was done with the HCPC procedure from the FactoMineR package (Husson et al., 2015).
194 The Ward algorithm was used to build the tree, and then the k-means consolidation to establish the clusters.
195 For each cluster, average of farm characteristics and environmental impacts were computed. In addition, a
196 nonparametric approach of Kruskal-Wallis was used to determine differences among clusters, followed by a
197 post hoc test using the Kruskal-Nemenyi test (Pohlert, 2016).

198 2.3 Mitigation measures and economic analysis

199 Scenario analysis was conducted by introducing improvement strategies for analyzing possible future
200 technological changes that lead to GHG emissions reductions. The selection of these strategies was based on
201 the characteristics of clusters identified, literature review and expert opinion (Bogaerts et al., 2017; Cardoso
202 et al., 2016; Mazzetto et al., 2015). In the scenario analysis, we considered as a mitigation measure the
203 establishment of improved pastures to increase forage yield and the stocking rate and improve the forage
204 quality on-farm. In addition, the adoption of electric fences that allow rotational grazing was also considered
205 as a good pasture management practice that could be adopted by farmers in conjunction with the mitigation
206 measure. We evaluated the adoption of improved pastures only in the area necessary for producing the
207 current forage demand of cattle, which is less than the current area that farmers use for cattle rearing
208 activities, and by this, the stocking rate can increase. We assumed the establishment of a forage plant with
209 dry matter digestibility equal to 65%, crude protein content of 12%, dry matter productivity of 35 T ha yr⁻¹,
210 and that can be implemented in the low tropics (< 1200 masl).

211 Additionally, we estimated the relative costs of the establishment and maintenance of improved pastures
212 and electric fence, and the quantities of GHG emissions that would be reduced after implementing these
213 measures. Consequently, we were able to quantify the economic benefits associated with achieving
214 reductions in GHG emissions. The GHG emissions reductions of this measure were estimated as the annual
215 average of the difference between the total GHG emissions of the baseline scenario and the total emissions
216 under the scenario based on the adoption of the different mitigation measures (de Oliveira Silva et al., 2015).
217 For estimating the GHG emissions from electric energy use by operation of electric fences, we used an
218 electricity consumption of 42 kWh ha⁻¹ yr⁻¹ (Gutiérrez et al., 2018), and an emission factor for electric energy
219 use in Colombia of 0.199 kgCO₂ kWh⁻¹ (UPME, 2016). The cost-effectiveness of the mitigation measures was
220 estimated as the difference between the gross margin in the baseline and the gross margin in the scenario
221 with the mitigation measure implemented, divided by the GHG emissions reductions. The gross margin in
222 both scenarios was estimated as the difference between the revenues and expenses of farms in a period of
223 one year. Revenues come only from the hypothetical sale of all live weight (LW), and all milk produced per
224 farm per year. Prices of milk and meat sold were obtained from the Colombian National Cattle Ranchers
225 Federation (FEDEGAN, 2019). Farm expenses were composed of investment and maintenance costs for the
226 implementation of improved pastures and electric fence. The associated costs for the establishment and
227 maintenance of this measure was calculated according to Gutierrez et al. (2018), which accounted for farm
228 operations and quantities of inputs required (e.g., land adaptation, seeding, fertilizers, amendments to the
229 soil, forage seed, and electric fence).

230 3. Results and discussion

231 3.1 Nitrogen balance

232 Nitrogen surpluses obtained at the farm gate are usually attributed to N lost by gaseous emissions (i.e. NH₃,
233 N₂O and NO_x), leaching and runoff of nitrate to surface or groundwater, and soil N stock changes (Penati et
234 al., 2011). Due to the low amounts of inputs and low stocking rates, the DPS was characterized by low N

235 surplus per ha (14.7 kg N ha⁻¹ year⁻¹) in most of the farms used in the current study. In comparison high input
 236 farms used as much as 186 kg N ha⁻¹ year⁻¹ (Penati et al., 2011). In some farms, the main N input was the
 237 atmospheric deposition (15 kg N ha⁻¹), as purchased N fertilizer was low (11 kg N ha⁻¹ year⁻¹). The mean N
 238 outputs in milk (6.5 kg N ha⁻¹ year⁻¹) and meat (6.0 kg N ha⁻¹ year⁻¹) were similar, which reflects the dual-
 239 purpose orientation of the farms. On average, the total N surplus was 15.0 kg N ha⁻¹ year⁻¹, at the same time,
 240 direct and indirect N emissions were 15.9 kg N ha⁻¹ year⁻¹. These results are comparable to those of Penati et
 241 al. (2011) for Italian extensive highland dairy systems (6.4 kg N ha⁻¹ year⁻¹), which are characterized by the
 242 low N inputs.

243 3.2 Annual methane (CH₄), nitrous oxide (N₂O), and carbon dioxide (CO₂) emissions

244 Emissions from enteric fermentation was the main source of CH₄ emissions, while the contribution of manure
 245 deposited on pastures was very small (Table 4). This behavior is typical for extensive cattle systems in the
 246 Latin American tropical region where excreta management is rare (Cerri et al., 2016; Gaitán et al., 2016;
 247 Mazzetto et al., 2020).

248 **Table 4**

249 Annual methane (CH₄) emission from farm production estimated using both the IPCC's 2006 and 2019 Refinement to
 250 the IPCC's 2006 greenhouse gas inventory guidelines

	Dual purpose cattle farms (n = 1313)		
	2019 Refinement to IPCC 2006 inventory guidelines		
	Mean	Min	Max
<i>Enteric fermentation</i>			
Herd, kg CH ₄ per AU ^a	103.3 (99%)	52.2	181.1
<i>Manure</i>			
Pasture, kg CH ₄ per AU	1.3 (1%)	0.6	2.4
Total, kg CH ₄ per AU	104.6	52.8	183.5

^a AU: Animal Unit (1 AU being either 1 cow, or 3.3 female and male calves less than 1 year, or 1.7 female and male calves 1 - 2 yr, or 1.3 heifers 2-3 yr, or 1.3 steers 1- 2 yr, or 0.8 bulls)

251 In general, we observed that direct N₂O emissions from excreta deposited on grazed pastures were the main
 252 source of N₂O emissions (51%), while indirect N₂O emissions from volatilization of NH₃ amounted to 28.7%
 253 of total emissions, mostly coming from animal excreta (27%) (Table 5). The contribution of fertilizers, in both
 254 direct and indirect emissions, was too low mainly due to the low adoption of this practice.

255 **Table 5**

256 Annual nitrous oxide emissions (N₂O) from the farm production

	Dual purpose cattle farms (n = 1313)		
	2019 Refinement to IPCC 2006 inventory guidelines		
	Mean	Min	Max
<i>Directly</i> (kg N ₂ O-N per ha)			
Manure (pasture)	0.3 (51%)	0.01	1.0
Fertilizer	0.1 (20.3%)	0	6.2
<i>Indirectly</i> (kg N ₂ O-N per ha)			
From NH ₃ (excretions)	0.1 (27%)	0.003	0.5
From NH ₃ (fertilizer)	0.01 (1.7%)	0	0.50
Total (kg N ₂ O-N per ha)	0.52	0.01	8.2

257 Carbon dioxide emissions due to liming and burning of diesel fuel had large variation among farms, which
 258 depended on the quantities of lime and diesel fuel used (Table 6).

259 **Table 6**

260 Annual carbon dioxide emission (CO₂) from the farm production

	Dual purpose cattle farms (n = 1313)
--	--------------------------------------

CO ₂ emissions	Mean	Min	Max
<i>Directly</i>			
Liming, kg CO ₂ per ha	4 (56%)	0.0	260
Diesel fuel, kg CO ₂ per ha	3.2 (44%)	0.03	53.5
Total (kg CO ₂ per ha)	7.2 (100%)	0.00	260.0

261 3.3 Allocation of environmental burdens between meat (LWG) and milk (FPCM)

262 Economic, energy, and mass methods were used to assign the environmental burdens between milk and live
263 weight gain and to identify variations. When using these allocation methods, the proportion of
264 environmental burdens allocated to meat differed, with the economic method assigning the greater burden,
265 followed by energy content (Table 7). When applying mass allocation, emissions per kg LWG were lowest and
266 emissions per kg FPCM were highest. Rice et al. (2017) found a similar trend as ours for the proportion of
267 GHG allocated to meat depending on the allocation method used, increasing from the mass, to the energy,
268 and to the economic allocation method.

269 **Table 7**

270 Effect on emission per kg products with different allocation methods of greenhouse gas emission between meat and
271 milk

	Dual-purpose cattle farms (n = 1313)		
	Mean	Min	Max
Meat CO ₂ -eq, % of total			
Economic ^a	36	4	84
Energy ^b	30	3	79
Mass	13	1	55
Emission after allocation (meat), kg CO ₂ -eq per kg LWG			
Economic	12.8	4.5	36.6
Energy	10.5	3.5	32.8
Mass	4.4	1.2	18.2
Emission after allocation (milk), kg CO ₂ -eq per kg FPCM			
Economic	2.9	1	8.4
Energy	3.3	1	10.2
Mass	4.3	1	18.2

^a 1 kg FPCM = 1000 COP; 1 kg live weight gain = 4364 COP

^b Energy value of milk = 2.9 MJ kg⁻¹; energy value of carcass meat = 9.25 MJ kg⁻¹

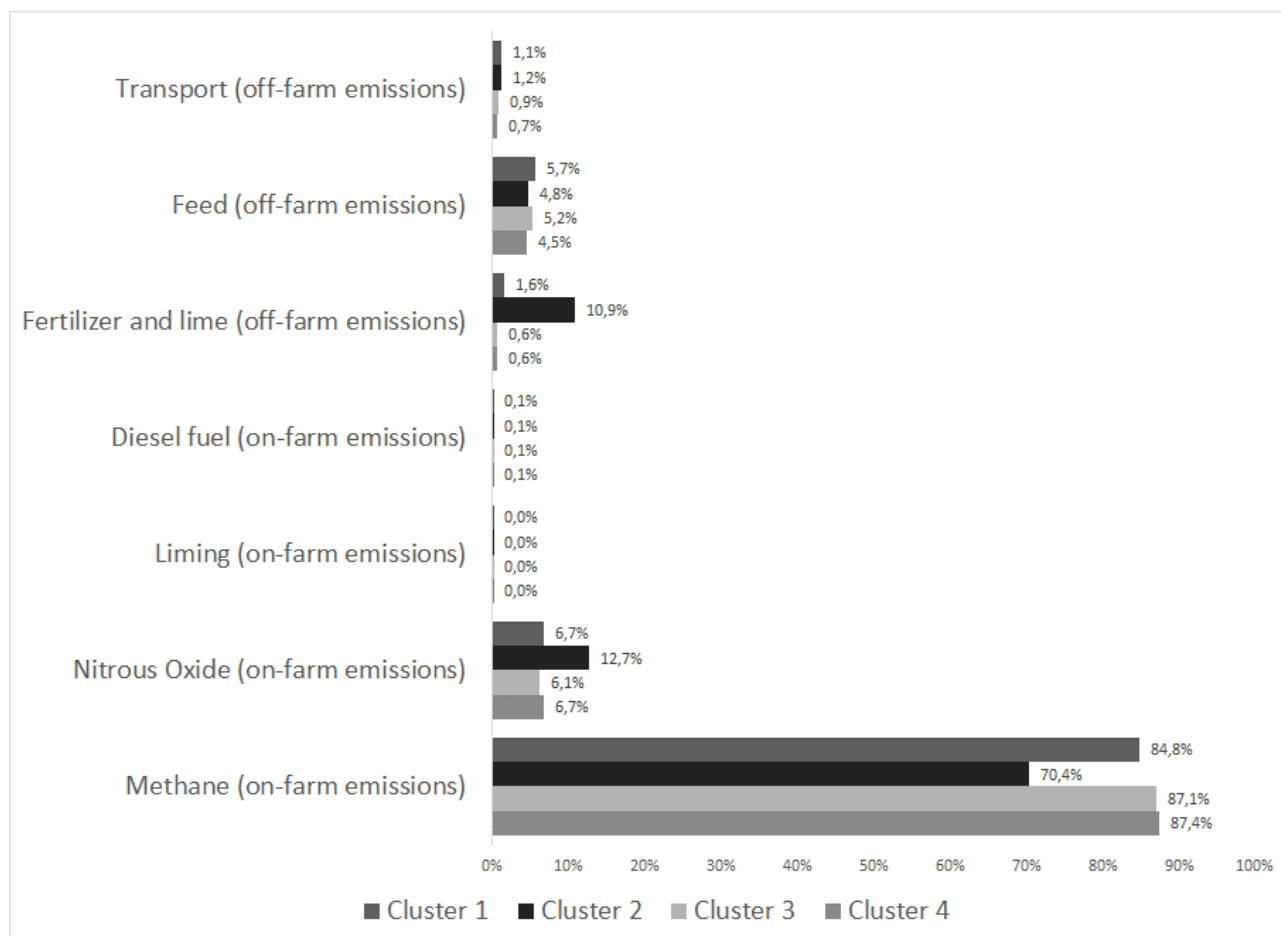
272 As recommended by Rice et al. (2017) when selecting an allocation method, the quality and reliability of data
273 should be the most important factor. Consequently, in the multivariate analysis we decided to include results
274 of the environmental performance of farms after economic allocation, which is associated to the fact that
275 the ratio of milk and meat prices has been steady in Colombia (FEDEGAN, 2017).

276 In Latin America, an LCA study for DPS in Nicaragua allocated the total environmental burden to milk (Gaitán
277 et al., 2016). Similarly, an LCA dairy study in Brazil did not consider allocation approaches (de Léis et al., 2015).
278 An LCA study for dairy systems in Peru (Bartl et al., 2011) and the evaluation of cow-calf stage in an LCA for
279 beef production in Mexico (Rivera-Huerta et al., 2016), found identical proportions as our economic approach
280 after applying the economic allocation method. In addition, an LCA study in Costa Rica that included DPS,
281 applied an expanded boundary LCA of coupled dairy and beef production to avoid the allocation of
282 environmental burdens (Mazzetto et al., 2020). As there is no consensus among LCA studies regarding which
283 allocation method to apply, the estimation of impacts per product cannot be established precisely, and
284 variations in results can exist. A common framework for allocation would allow, for future LCA evaluations,
285 the partitioning of environmental burdens amongst co-products on a consistent basis, and consequently,

286 identify hotspots and behaviors per product, and compare results between studies. This would also facilitate
 287 the establishment of policies aimed at supporting mitigation and adaptation actions for the cattle sector.

288 **3.4 Contribution of on-farm and off-farm processes to total greenhouse gas emissions (GHG) by cluster**

289 In all the clusters most of the GHG emissions arose from on-farm activities related to enteric fermentation
 290 and manure deposited on pasture (Figure 2). Fertilization, and excreta management were limited, therefore
 291 the contribution of N₂O to on-farm emissions was much lower than CH₄ from enteric fermentation. On-farm
 292 carbon dioxide emissions were low due to the little use of machinery and liming. The ranking of off-farm
 293 emissions was mostly influenced by the amount of purchased feed, followed by agrochemical inputs and
 294 transport. A similar structure of GHG emissions distribution was also reported for DPS in Nicaragua and Costa
 295 Rica, which were low input dependent and based the feeding strategy adopted in sown and naturalized
 296 pastures (Gaitán et al., 2016; Mazzetto et al., 2020). Our results have a similar trend in the distribution of
 297 GHG emission of cattle milk and meat for the Latin American countries reported by Gerber et al. (2013), with
 298 methane being the main source of emissions. Gerber et al. (2013) assigned around 50% of total emissions to
 299 enteric fermentation (without counting emissions from land-use change), however, these figures are lower
 300 than our findings where this source of emissions accounted for more than 70% of total emissions. The above
 301 is mainly related to the fact that studied farms were low input farms and most emissions were from the
 302 animals. When farms intensify their production, GHG emissions arising from animals reduce, while those
 303 from excreta management and inputs production and use increase (Rotz, 2018).

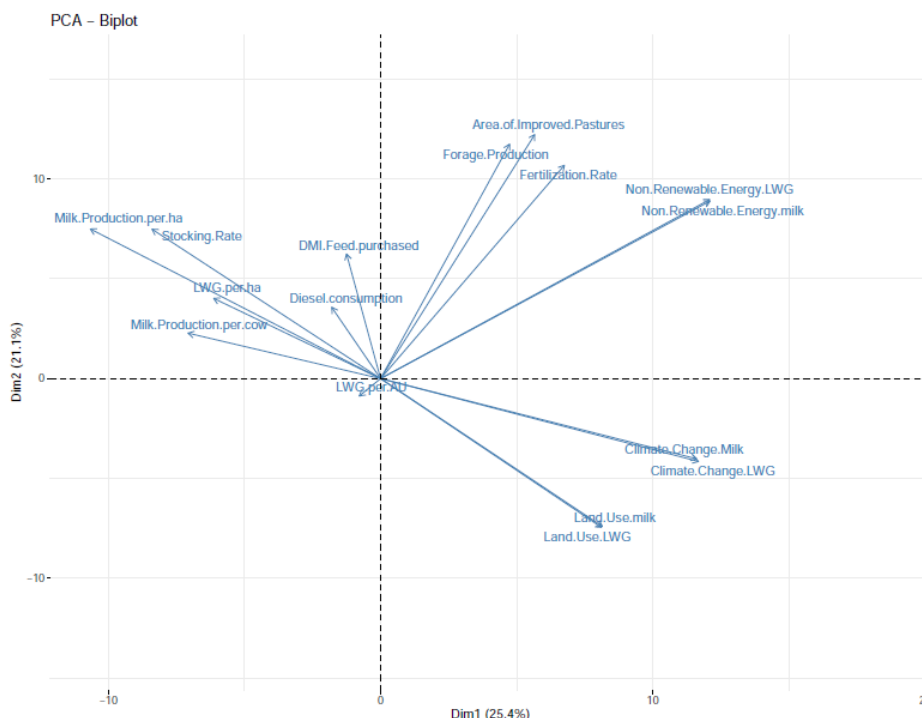


304 **Figure 2. Contributions of different on – farm and off – farm processes to total greenhouse gas emissions**
 305 **from dual – purpose farms at the farm gate located in 13 departments of Colombia (n=1313)**
 306

307 3.5 Variation among farms and interpretation of clusters

308 The large number of farms assessed (n=1313) provides a potential to identify relationships among
 309 environmental performance and farming practices, allowing for the proposal of strategies to increase
 310 productivity and mitigate GHG emissions.

311 According to the bi-plot resulting from the PCA (Figure 3), milk yield (kg FPCM cow⁻¹ year⁻¹; kg FPCM ha⁻¹
 312 year⁻¹) and meat production per hectare were positively correlated to the stocking rate (AU ha⁻¹), as they were
 313 located in the same area of the graph. These variables were negatively correlated to emission (per kg FPCM
 314 and per kg LWG) and LU (per kg FPCM and per kg LWG). This means that increased milk per cow and ha, and
 315 meat per ha leads to reduced CF and LU per kilogram FPCM and per kilogram LWG. The analysis also showed
 316 a positive correlation among percentages of area of improved pastures, fertilizers application rate, forage
 317 production per ha, and non-renewable energy use (per kg FPCM and per kg LWG). Farms with high
 318 percentages of improved pastures used more synthetic fertilizers, which explains the positive correlation
 319 with non-renewable energy use.



320 **Figure 3. Bi-plot for the principal component analysis (PCA) with information collected from 1313 DPS of**
 321 **Colombia**
 322

323 After cluster analysis, four groups of farms were identified (Table 8). Average milk production for all farms
 324 are similar to the lower values of the production ranges reported for DPS in Latin America (Gaitán et al., 2016;
 325 Rojo-Rubio et al., 2009). However, results of cluster 1 and 3 are comparable with average values reported for
 326 DPS in Colombia, while clusters 2 and 4 presented lower yields. Farms of all groups base their feeding strategy
 327 on grazing on sown pastures all year round, with feed purchased (% of DM) being lower than 4% of DM in all
 328 clusters, a typical characteristic of extensive cattle systems in Latin America (Rao et al., 2015).

329 **Table 8.**

330 Means for selected farm variables for four farm clusters of 1313 dual-purpose cattle farms in Colombia

	Cluster 1, n = 261	Cluster 2, n=220	Cluster 3, n = 603	Cluster 4, n = 229
Mean	Mean	Mean	Mean	Mean

Stocking rate, AU ha ⁻¹	2.8	a	1.0	b	1.1	b	1.1	b
Milk production, kg FPCM ha ⁻¹ year ⁻¹	3021.8	a	735.1	c	1000.5	b	522.7	c
Milk production, kg FPCM cow ⁻¹ year ⁻¹	1510.1	a	1208.7	b	1416.4	a	930.9	c
Meat production, kg LWG AU ⁻¹ year ⁻¹	87	bc	96.0	b	107.4	a	80.4	c
Meat production, kg LWG ha ⁻¹ year ⁻¹	357.3	a	101.2	b	130.9	c	111.4	b
Area of improved pastures, %	32	b	72	a	5	c	6	c
Fertilizer application rate, kg ha ⁻¹ year ⁻¹	76.9	b	185.5	a	25.6	c	25.9	c
Feed purchased, % of DMI	3.8	a	3.6	ab	3.2	b	2.6	c
Dry matter production, Ton ha ⁻¹ year ⁻¹	10.8	b	13.3	a	8.6	c	8.6	c
Diesel consumption, L ha ⁻¹ year ⁻¹	2.2	a	1.4	b	0.9	c	1.8	d
Carbon footprint, CO ₂ -eq kgFPCM ⁻¹	2.1	d	3.1	b	2.4	c	4.2	a
Carbon footprint, CO ₂ -eq kgLWG ⁻¹	9.0	d	13.6	b	10.5	c	18.3	a
Non-renewable energy use, MJ kgFPCM ⁻¹	1.0	c	3.8	a	0.9	d	1.4	b
Non-renewable energy use, MJ kgLWG ⁻¹	4.6	c	16.6	a	3.8	d	6.0	b
Land Use, m ² kgFPCM ⁻¹	3.0	c	13.7	a	10.2	b	25.2	a
Land Use, m ² kg LWG ⁻¹	12.5	c	59.0	a	44.5	b	108.6	a

Variable means with different letters across rows are significantly different at P < 0.05

331 Cluster 1 (261 farms) had the highest milk yield, meat production (per ha), stocking rate and diesel fuel
332 consumption. This cluster presented the second largest application rate of fertilizers, area of improved
333 pastures, and dry matter production. This led to the lowest results for GWP and land use among clusters, and
334 the second lower results for non-renewable energy use due to high diesel fuel consumption.

335 Cluster 2 (220 farms) had the highest area of improved pastures and application rate of fertilizers. These
336 farms had the highest dry matter production and the lowest stocking rate, which points to an inefficient use
337 of the pasture. In addition, the production parameters were also low. Due to these characteristics, this cluster
338 presented the highest non-renewable energy use and the second highest values for GWP and LU.

339 Cluster 3 consisted of 603 farms, had the highest LWG (per AU), the second highest milk yield (per cow and
340 per hectare), meat production per ha, and stocking rate, and the lowest consumption of diesel among groups.
341 Additionally, the area of improved pastures, fertilizer application rates, and dry matter production were the
342 lowest amongst clusters. These characteristics led to the lowest non-renewable energy use and the second
343 lowest value for GWP and LU. Despite the lower implementation of improved pastures and forage production
344 among clusters, these farms had high milk and LWG production.

345 Cluster 4 included 229 farms, had the lowest milk yield, LGW production (per AU), area of improved pastures,
346 application rate of fertilizer and stocking rate. The low productive performance of these farms led to the
347 highest GWP and LU, and the second highest non-renewable energy use among groups.

348 3.6 Environmental impacts and comparisons with other studies

349 The CF results were negatively correlated with milk production. This result, in terms of CO₂-eq per kg FPCM,
350 is in agreement with the findings of Gaitán et al. (2016) for DP farms in Nicaragua. This means that a general
351 increase in productivity, per animal and per hectare, might reduce CF, as was also suggested by de Léis et al.
352 (2015) for dairy production systems in Brazil. Results for Cluster 1 are similar to those reported for intensive

353 silvopastoral systems in Colombia (Rivera et al., 2016), and slightly higher than those for climate smart farms
354 in Nicaragua (Gaitán et al., 2016). In addition, results for Cluster 3 are comparable to the level estimated by
355 Rivera et al. (2016) and Gaitán et al. (2016) for conventional systems, while values for Clusters 2 and 4 are
356 higher than those reported in these studies. Due to the lower milk yield and stocking rate, our results are
357 higher than CFs informed for specialized dairy farms in developed countries (Ross et al., 2017; Sejian et al.,
358 2018; Styles et al., 2018).

359 In Latin-America, CF from beef systems range from 9 to 43 kg CO₂-eq per kg LWG (Dick et al., 2015; Modernel
360 et al., 2018; Ruviaro et al., 2015). Our results are at the lower end of this range and are also similar to CF
361 informed for specialized beef production systems (Alemu et al., 2017; Mogensen et al., 2015). Emissions for
362 Clusters 1 and 3 are comparable with those reported for more intensive systems, while results for Clusters 2
363 and 4 are closer to those of extensive systems. The relatively lower values found in this study are probably a
364 consequence of the allocation of emissions between co-products, with a lower proportion assigned to meat,
365 while in pure beef systems all GHG emissions are allocated to meat. This suggests that meat produced
366 through DPS could be more environmentally friendly than meat produced in purely beef systems. The
367 existence of a system where beef can be supplied from dairy farms while maintaining productivity within the
368 dairy industry has been proposed as a good option to reduce GHG emissions from beef production in Ireland
369 (Casey and Holden, 2006). Thus, well managed dual-purpose farms could attain higher meat production,
370 replacing a greater percentage of meat from exclusively beef systems and thus reduce environmental
371 burdens from the cattle sector. This could be an effective strategy to accomplish the national goals of GHG
372 emissions reduction.

373 The process which had the most energy use was fertilizer production off-farm. Cluster 2, which relies more
374 on external inputs, showed the highest demand for non-renewable energy. Despite Cluster 1 having the
375 second-largest fertilizer application rate, its high milk and meat yields reduced the impact of non-renewable
376 energy use. Cluster 3 had the lowest non-renewable energy use per kg milk and meat of all the four clusters.
377 This trend was also reported in dairy systems in Colombia, where a conventional system had higher non-
378 renewable energy used than a silvopastoral system, mainly due to its higher used of external inputs (Rivera
379 et al., 2016). Results for clusters 1, 3 and 4 are lower than those reported by Zucali et al. (2017), Battini et al.
380 (2016), and Modernel et al. (2013), however, results for Cluster 2 are similar.

381 The grazing area was identified as the most important contributor to land use, with more than 98% in each
382 cluster. Similarly, Dick et al. (2015) reported that grassland occupied large areas (~100% of the farm area) on
383 farms based on extensive and improved beef systems in Brazil, and Rivera et al. (2016) found that 92% of
384 land use in intensive silvopastoral dairy systems in Colombia was left to pasture cultivation. Increasing
385 stocking rate while maintaining the availability and quality of forage, could be an effective strategy not only
386 to reduce land use but also GHG emissions.

387 *3.7 Improvement options and implications*

388 Clusters 1 and 3 had higher milk productivity (per cow and per hectare) and meat production per ha than
389 clusters 2 and 4. This can be due to better herd reproductive practices (González-Quintero et al., 2020), which
390 have been reported as strategies that allow the increasing of herd productivity in Latin American cattle
391 systems (Holmann et al., 2003). In turn, clusters 1 and 2 were characterized by higher dry matter per ha of
392 pasture and a larger proportion of improved pastures. This might be due to better pasture renewal practices
393 than the other 2 clusters. These practices are associated with mechanization, fertilization, weed control,
394 planting grass, rotational grazing, and electric fences (González-Quintero et al., 2020).

395 Two production strategies can be identified among dual-purpose farms. The first, depicted in Clusters 1 and
396 2, is basing the feeding strategy on a combination of improved and natural pastures, combined with the
397 highest fertilizer application rates. The second is found in farms of Clusters 3 and 4, where the feeding

398 strategy is based on grazing natural pastures, with low input of fertilizers. However, there was a significant
 399 difference in terms of productivity of milk and meat (per ha) between clusters from each way of production
 400 strategy. This led to a lower GHG emissions in Clusters 1 and 3 compared to Clusters 2 and 4.

401 The above analysis provides insight into possible technological changes and management options that can
 402 increase the productivity parameters and improve the environmental performance of DPS. In order to move
 403 from Cluster 2 to Cluster 1, livestock managers should improve pasture management and increase stocking
 404 rate. Similarly, to change from Cluster 4 to Cluster 3, farmers should adopt the good agricultural practices
 405 developed by farms from Cluster 3 which corresponded to rotational grazing, reproduction practices such as
 406 artificial insemination, controlled natural mating and reproductive control on cows, and record-keeping to
 407 better control farm activities. With these changes, it would be possible to reduce GHG emissions without
 408 vast investments.

409 For the right establishment of policies aimed at supporting mitigation and adaptation actions for the cattle
 410 sector in Colombia, it is important to know the relative cost-effectiveness for the implementation of
 411 improved pastures as a mitigation measure. Results for the first year, after the implementation of improved
 412 pastures, showed positive cost-effectiveness for clusters 1, 2 and 4, while the result for Cluster 3 was negative
 413 (Table 9). However, for the following years after the implementation, the cost-effectiveness for all clusters
 414 was negative. The above suggests that cost savings can be achieved by adopting improved pastures, while
 415 reducing GHG emissions. Additionally, it is important to note that in the first year GHG emissions reductions
 416 were achieved for all clusters. Similar cost-effectiveness values were obtained in a study conducted in Brazil,
 417 where the implementation of improved pastures for land restoration reached negative cost-effectiveness (de
 418 Oliveira Silva et al., 2015).

419 **Table 9.**
 420 Marginal cost effectiveness, emissions reductions, and environmental performance of clusters after improved pastures
 421 establishment

	Cluster 1	Cluster 2	Cluster 3	Cluster 4
	Mean	Mean	Mean	Mean
Marginal cost-effectiveness first year (establishment), US\$ (t CO ₂ e) ⁻¹ yr ⁻¹	0.09	0.05	-0.05	0.03
Marginal cost-effectiveness following years (maintenance), US\$ (t CO ₂ e) ⁻¹ yr ⁻¹	-0.11	-0.06	-0.19	-0.13
Carbon footprint (% variation with baseline), CO ₂ -eq kgFPCM ⁻¹	1.6 (-25%)	2.0 (-37%)	1.6 (-34%)	2.2 (-48%)
Carbon footprint (% variation with baseline), CO ₂ -eq kgLWG ⁻¹	6.8 (-25%)	5.0 (-37%)	6.9 (-34%)	9.5 (-48%)

422 Reductions in total GHG emissions led to a lower CF in all clusters in comparison to the baseline (Table 9).
 423 Cluster 2 reached similar values as Cluster 1, and Cluster 4 obtain even lower values than Cluster 3, due to an
 424 increased quality and yield of grasslands. By increasing the pasture productivity, less area is required to meet
 425 the same demand of the baseline, which means forage availability optimally fulfill cattle nutritional
 426 requirements. These new CFs figures, especially for clusters 1 and 2, are close to values reported for
 427 specialized dairy systems in Latin America and developed countries (Bava et al., 2014; Dalgaard et al., 2014;
 428 de Léis et al., 2015; Salvador et al., 2017), which points out the possibility of DPS to achieve better
 429 environmental performance with negative cost-effectiveness.

430 Around 69.2% of the studied farms had less than 50 animals, which agrees with the percentage distribution
 431 of livestock farms in Colombia where 82% have less than 50 heads of cattle and are considered to be small
 432 ranchers (González-Quintero et al., 2020; ICA, 2019). In addition, DPS in Colombia are known to have low
 433 adoption of technology, low productive parameters and low profitability (González-Quintero et al., 2020).
 434 Studied farms were pastured based systems and rely mostly on the use of natural pastures and a lesser extent

435 on improved ones. Because of the low farm profitability and socio-economic status of DPS, economic
436 investment is a barrier to the adoption of improved pastures. Most of the Latin American countries, except
437 for Brazil and Argentina, do not have policies or governmental programs for mitigation and adaptation to
438 climate change focusing on the agricultural sector (González-Quintero et al., 2015). Therefore, it is necessary
439 to provide incentives for the adoption of improved pastures such as increased availability and accessibility of
440 seeds, inputs, and subsidies for labor, tax exemptions, financing technical assistance, payment for
441 environmental services (PSE), and soft loans (Murgueitio, 2009). These incentives, which include public policy
442 instruments, are important for achieving the implementation of these kinds of measures on a larger scale,
443 allowing producers to have access to projects that foster measures for increasing cattle productivity and
444 increasing environmental benefits.

445 4 Conclusions

446 The largest source of GHG emissions in dual-purpose systems in Colombia arises from cattle herds, where
447 methane from enteric fermentation and N₂O from excretions deposited on pastures are the main
448 contributors to GHG emissions. Therefore, the carbon footprint of products leaving the farm will be sensitive
449 to the amount of enteric methane and nitrous oxide from pastures in relation to the amount of milk and
450 meat produced.

451 The current study identified two production strategies, a more intensive strategy with high proportion of
452 improved pasture and higher fertilizer application rates and a more extensive strategy with low input of
453 fertilizers and grazing on natural pastures. Both strategies had a cluster of better farms (Cluster 1 and Cluster
454 3) that provided low carbon footprint values which were in the same range and a cluster of farms that had
455 higher carbon footprint values (Cluster 2 and Cluster 4). Within both strategies, the two groups of farms had
456 either low or high milk yield per cow and productivity (milk and meat) per ha. This suggests that both
457 extensive and more intensive strategies for the dual-purpose cattle systems can lead to lower carbon
458 footprint values and provide promising mitigation options. The balance between the inputs used and the on-
459 farm emissions in relation to the milk and meat produced is the main determinant for the outcome of the
460 carbon footprint and improvements that optimizes the effective use of resources will reduce the carbon
461 footprint.

462 Despite the differences in management practices between both production strategies, our results suggest
463 that the identification of an adequate fertilizer application rate and the implementation of better agricultural
464 management practices, such as improved pastures had the potential to increase both the quality and amount
465 of animal feed and reduce the carbon footprint. Therefore, these farming strategies are promising mitigation
466 measures for reducing GHG emissions per kg of milk and meat at the farm gate after allocation, for dual-
467 purpose cattle systems in Colombia. In addition, the mitigation practices showed a negative cost-
468 effectiveness after the implementation period.

469 This study contributes to a better understanding of the environmental impacts of intensive and extensive
470 dual-purpose systems in Colombia. By highlighting a cost-effective mitigation option, this paper provides an
471 insight into the sustainable intensification process for the Colombian dual-purpose cattle systems.

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