Farmers' environmental perceptions and preferences regarding climate change adaptation and mitigation actions - towards a sustainable agricultural system in México

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13 Abstract: Climate change compromises sustainable agricultural development. It has deep 14 economic, environmental, and social impacts, particularly on vulnerable rural regions in developing 15 countries where agriculture constitutes the backbone of the economy. This study analyzes farmers' preferences regarding the potential implementation of several mitigation and adaptation actions 16 addressing climate change. Data were collected on 370 farmers in the "Valle del Carrizo" region of 17 18 northwestern México. Using the Analytical Hierarchy Process (AHP) methodology, the farmers' 19 preferred mitigation and adaptation actions were identified and related to their stated attitudes 20 regarding risks using the Multiple Price List (MPL) lotteries approach. Farmers' environmental 21 beliefs and perceptions as key means of understanding concepts of sustainability were related to their 22 preferences. The use of less polluting machinery and investment in improving irrigation infrastructure 23 were identified as the most preferred actions. Environmental opinions reviewed using the New 24 Ecological Paradigm (NEP) scale allowed for the identification of the participants' ecocentric and 25 anthropocentric attitudes, highlighting the commitment of most farmers to the sustainable use of natural resources. Agricultural policies should be developed according to farmers' preferences and 26 27 behaviors. The design and implementation of measures and policy tools addressing climate change 28 should be inclusive and developed at the micro-level considering farm and farmer typologies.

Keywords: climate change, adaptation, mitigation, sustainable agriculture, environmental factors,
 Analytical Hierarchy Process, New Ecological Paradigm scale.

31

32 **1. Introduction**

Climate change is one of the most significant challenges facing human society. The ways in which weather events are developing pose social, economic, and environmental risks and are raising more concern with the appearance of various unexpected phenomena such as floods, storms, droughts, and heat waves. Climate change refers to the variation of the earth's climate generated either by natural causes or human actions that affect the variability of climatic parameters such as temperature, rainfall, and drought [Gan et al., 2016].

Climate change compromises sustainable agricultural development, which is based on three converging levels of environmental, economic, and social impact. Climate change is not only an environmental phenomenon, but it has also deep economic and social consequences, especially for vulnerable developing countries, posing great challenges to their agricultural development and welfare [Tesfahunegn, Mekonen, & Tekle, 2016]. The effects of climate change are closely related to a decline in economic growth, complicating efforts to reduce poverty and to ensure the food security of marginalized local agricultural communities [López & Hernández, 2016].

Agriculture is of great importance to the economic development of developing countries and constitutes the backbone of their economies by providing their populations with food, raw materials, and employment opportunities [Ogen, 2007]. Socially, agriculture forms the basis for achieving food security, which basically depends on the eradication of extreme poverty and hunger [Von Braun, Swaminathan & Rosegrant, 2004]. Agriculture is essential to community livelihoods in rural and marginal areas. In this context, agricultural policies and public intervention in rural communities are necessary tools that contribute to the reduction of poverty as part of an economic and social development approach [Croppenstedt, Knowles, & Lowder, 2018].

Climatic patterns are the most significant input factor for agricultural production [Frutos et al., 2018], and their variability is closely related to output productivity. At the same time, the agricultural sector and animal farming in particular constitute an important source of greenhouse gas (GHG) emissions, which are closely related to climate change [Rivera & DiPaola, 2013]. Agriculture in regions of Africa and Latin America is most vulnerable to climate change due to its geographic positioning and because local economies and populations rely heavily on agriculture activities for subsistence purposes, especially in rural and marginal areas [Ortiz, 2012].

61 In the study region examined in the present work, climatic conditions are extreme and have in 62 recent years become even more atypical with high levels of precipitation occurring over short periods 63 and with lower temperatures than normal recorded [Lara et al., 2017]. Such patterns have affected 64 levels of agricultural production and crop quality and jeopardized food security within the region and 65 country. Additionally, climate change projections associated with global warming establish temperature increases of 0.5°C to 1.0°C for 2020 and of 2°C to 4°C for 2080, variations in rainfall of 66 67 +10% to -20% by 2050, and a decrease in rainfall of 5% to 30% by 2080 [Flores et al., 2012]. Such 68 patterns will increase vulnerability to flooding and other natural disasters and lead to changes in water 69 availability mainly affecting the agricultural and livestock sectors.

70 Climate change is also related to societal development. Relationships between society, 71 agriculture and economic development in rural areas are closely linked to the consequences of climate 72 change [Valladolid, 2017; Maia, Miyamoto, & Garcia, 2018]. Currently, the effects of climate change 73 in different regions are heterogeneous due to specific human activities and regional economic, 74 climatic, and social characteristics [Frutos et al., 2018]. Therefore, the implementation of strategies 75 to adapt production in agricultural systems or mitigate effects of climate change on outputs must be 76 implemented according to each region, farmers' characteristics and farming activities [Aguiar et al., 77 2018; López et al., 2016].

78 Climate change adaptation actions corresponds to initiatives and measures focused on reducing 79 the vulnerability of natural and human systems to effects of actual or expected climate change [IPCC, 80 2014] or on reducing the likelihood of an object, person or system suffering negative impacts. Not 81 considering the effects of climate change has negative implications for adaptation capacities, resulting 82 in a more vulnerable situation that does not contribute to environmentally sustainable agriculture 83 [Wheaton & Kulshreshtha, 2011]. Vulnerability is generally associated with levels of poverty within 84 a region. Adaptation is intended to limit damage caused by current and projected climate change as 85 much as possible [Aguiar et al., 2018]. With respect to climate change adaptation, no industry has 86 more at stake than the agricultural sector [Lee et al., 2014]. Traditional agricultural practices can be 87 considered adaptation tools when applying improved, drought-tolerant strategies while avoiding 88 monoculture production [Altieri et al., 2015; Galindo et al., 2014].

89 Mitigation actions, according to the FAO, are measures adopted to reduce greenhouse gas 90 emissions and/or encourage the elimination of carbon through sinks. Climate change mitigation can 91 be achieved by limiting or preventing the generation of greenhouse gas (GHG) emissions and through 92 activities that reduce their concentrations in the atmosphere [IPCC, 2014]. To mitigate climate 93 change, it will be necessary to reduce demand for energy and ensure that energy consumption is based 94 on the use of low-carbon fuels. According to the two above described concepts of adaptation and 95 mitigation, it can be generalized that mitigation is responsible for addressing the causes of climate 96 change while adaptation focuses on reducing the effects of climate change. Since farmers depend 97 heavily on their crops, levels of production positively or negatively affect (their income) their 98 sustainability, reinforcing the need to implement adaptation strategies. Adaptation strategies are key 99 to improving the efficiency and productivity of the agricultural sector [Di Falco et al., 2011] by 100 reducing agricultural vulnerability to climate change.

Adaptation activities can range from testing and introducing new more resistant crop varieties to
 building retaining walls and storm barriers to protect residents and property from flooding [O'Garra,
 T., & Mourato, 2016]. According to Khanal et al. (2018), adaptation actions with the greatest impacts

104 on productivity are those related to soil and water management, which is followed by a change in the 105 sowing calendar and in crop variety selection [Khanal et al., 2018]. Specifically, a water management 106 adaptation involves investment in the improvement in irrigation infrastructure, which results in more

107 security in the availability of water for irrigation, in turn reducing dependence on rain cycles, allowing

108 for the reduction of evapotranspiration, and thereby achieving more productivity with less water

109 consumption. Similarly, the implementation of crop and variety changes or of changes in the sowing

110 calendar as adaptation strategies ensures a higher level of production [Khanal et al., 2019]. Climate

111 change mitigation actions are necessary to ensure that long-term agricultural productivity and food 112 security are not compromised, ensuring the sustainability of agricultural production [Acquah., 2011].

- security are not compromised, ensuring the sustainability of agricultural production [Acquah., 2011]. Through the implementation of mitigation strategies such as zero tillage methods, which allow for
- soil conservation as erosion decreases, it is possible to generate gains in food productivity [Di Falco
- 115 et al., 2011].

116 According whit the last, sustainable agriculture faces two main challenges: the total exploitation 117 of natural resources and environmental pollution [Hoang & Rao, 2010]. The development of 118 sustainable agriculture can help address the impacts of climate change. Sustainable agriculture is 119 based on the implementation of actions that help conserve environmental and economic resources 120 such as water and land inputs [Bertoni et al., 2018]. Sustainable agriculture involves the production 121 of food and other inputs through farmers' efforts and institutional participation in the use of new 122 technologies while preserving the environment and natural resources to meet current societal needs 123 and guarantee a better quality of life without compromising the resources of future generations 124 [Mubiru et al., 2017].

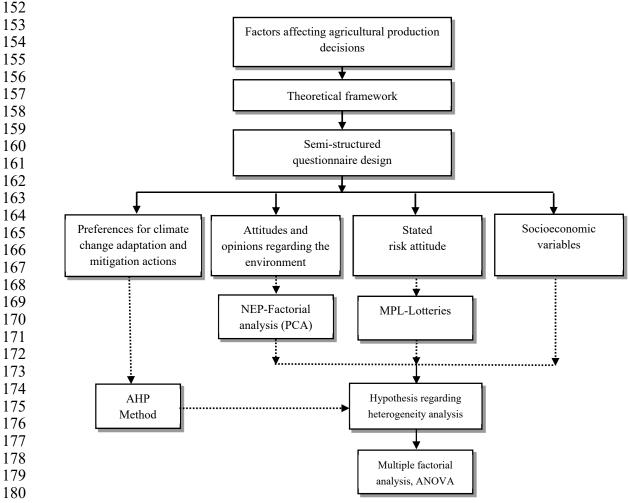
Therefore, understanding farmers' views and perceptions regarding climate change and the actions that they consider most effective against its impacts is critical. In particular, the analysis of farmers' preferences for different mitigation and adaptation actions can lead to the development of more sustainable agricultural systems. Such preferences are also related to farmers' views regarding environmental issues and to their ecocentric or anthropocentric beliefs. Environmental and ecological beliefs and opinions are key factors in understanding sustainability concept when related to agricultural activities [Reyna et al., 2018].

Within this context, the objectives of this research were to identify the relative importance of several climate change adaptation and mitigation actions related to agriculture activities in a marginal region in México in order to guide policy makers through the prioritized solutions that contribute to the sustainability of agricultural systems. Furthermore, farmers' attitudes, opinions, and beliefs towards the environment were evaluated in association with their preferences' patterns. The relation between farmers' preference structures with their risk attitudes and their socioeconomic characteristics was also analyzed.

140 **2. Materials and Methods**

141 To reach the abovementioned objectives, several methodological approaches were applied.. The 142 Analytical Hierarchy Process (AHP) was used to identify farmers' preferences and to estimate the 143 relative importance (i.e. priorities) of different mitigation and adaptation actions. We also used an 144 adapted form of the New Ecological Paradigm (NEP) Scale that was validated via factorial analysis 145 (PCA) to identify predominant latent environmental dimensions. Using the Multiple Price Lists (MPL) method or "lotteries," an alternative approach to expected utility risk elicitation, the farmers' 146 147 stated risk attitudes were estimated. Finally, a heterogeneity analysis was carried out to relate framers' 148 preferences to actions against climate change effects based on their environmental and stated risk 149 attitudes toward their farming activities.

Figure 1 summarizes the methodological approach applied in this study. In the following section, more information on our theoretical background and empirical application is given.



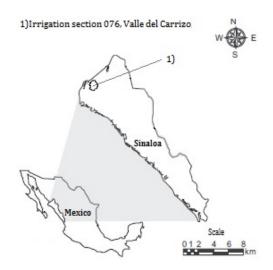
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Figure 1. Methodological research approach.

182 2.1 The case study and sample of farmers

183 The data was collected through the application of a face to face survey, corresponding to a 184 representative sample of 370 farmers from an agricultural area identified as Irrigation District 076 185 (DR076) in northwestern Mexico (Figure 2). The sample size was determined based on the formula 186 of finite populations with a confidence level of 95% and an error level of 4.99% [Rojas, 2005]. Data 187 collection was carried out in a stratified manner according to farm sizes (large and small), farmers' 188 ages (young and old) and sex to represent both men and women within the sample using a quota 189 sampling approach. The farmers completed semi-structured, face-to-face questionnaires from 190 October to December 2017. The questionnaire included 108 questions and was divided into several 191 blocks according to types of information collected. These were classified as 1) farmers' preferences 195 Each farmer took approximately 40 minutes to answer the interview questions, and interviews 196 were carried out with the support of students from the Autonomous Intercultural University of Sinaloa 197 who were trained to deliver the survey. Before the interviews, the survey was reviewed and approved 198 by the ethics committee of the Autonomous Intercultural University of Sinaloa following the ethical 199 principles of the Declaration of Helsinki and according to confidentiality rules and a privacy policy 200 guaranteeing the security of the personal data of each participant. In addition to the above, each 201 participant was informed of the survey's focus and of how he/she should respond to questions and 202 was asked to sign a consent form to participate in the study.

203



204 205

Figure 2. Location of the study area.

206 2.2 Description of the AHP methodology

207 The AHP method is a multicriteria analysis tool that was developed by Saaty at the end of the 208 1970s [Saaty, 2001]. It allows for the improvement in decision-making processes, in turn generating 209 added value in terms of knowledge [Moreno et al., 1998]. It is important to highlight that decision 210 making should be understood as a methodical process by which a person or group of people choose(s) 211 between two or more alternatives with different quantitative or qualitative attributes to achieve an 212 individual or common good that complies with previously conceived expectations [Moody, 1992]. 213 The AHP technique has been widely used in agricultural research mainly in analyzing farmers to 214 establish priorities in decision making, resolve agrarian and environmental problems and analyze 215 marketing issues related to consumers' preferences [Kallas & Gil, 2012; Ndamani & Watanabe, 2017; 216 Aslam et al., 2018].

217 The AHP method involves 3 main stages: 1) modeling, 2) assessment, and 3) prioritization and 218 synthesis. These stages form the methodological structure described below.

219 Stage 1. Modeling.

221

220 The activities of this stage, which are described below, include 1) problem definition and 2) structuring a decision model in the form of a hierarchy.

222

223 1. Problem identification and definition. We found that there was a lack of information on 224 farmers' preferences in northern Mexico regarding climate change mitigation and adaptation as a 225 normative framework in the establishment of public policies related to agricultural production to 226 reduce effects of climate change. Accordingly, several alternative actions were evaluated from a 227 literature review. Actions implemented to strengthen the resilience of food security systems to climate 228 change at multiple levels were defined as measures of adaptation, and actions aimed at reducing

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- greenhouse gas (GHG) emissions from agriculture were defined as mitigation measures while taking
 into account limitations inherent to the analyzed region [Mussetta et al., 2017].
- Identified adaptation and mitigation actions (criteria) representing the factors based on which the hierarchical analysis was carried out include:

234 Adaptation Measures

233

A1. Investment in improving irrigation infrastructure. A lack of basic irrigation infrastructure
 restricts agricultural adaptation to climate change. Irrigation infrastructure and to a lesser extent
 temperature control techniques (greenhouses) facilitate adaptation to climate change by reducing
 climate dependence [Castells et al., 2017].

A2. *Change in crops*. Niggol and Mendelson (2008) noted that in Latin America, farmers use crops change as a way to adapt to climate change, especially where temperature and precipitation affect the selection of crops, crop yields, and incomes [Niggol & Mendelson, 2008]. Changing cultivation methods is a good measure of adaptation, especially when it comes to reducing dependence on water resources, as is the case when less water-intensive crops are used, for instance [Moniruzzaman, 2015].

A3. *Introduce improved and resistant seeds*. Improved seeds can be used by farmers in different regions to adapt to climate change. Improved seeds, among their other characteristics, develop quickly; generate high yields; are drought, plague, and pest resistant; and are more resistant to flooding [Mohamed et al., 2018].

A4. Sowing calendar adaptation. As a measure of climate change adaptation, the adaptation of the sowing calendar to changes at the start of the rainy season guarantees optimal growth scenarios and lower risks of drought in significant periods of planting evolution. On the other hand, the use of rainwater has greater utility and increases crop yields [Waha et al., 2012].

Mitigation Measures

M1. Organic agriculture. According to Xiaohong et al. (2011), organic farming uses new varieties of efficient and sustainable ecological technology and has created new ways to mitigate agroecosystem emissions through, for example, the use of bio-digesters and those that reduce water consumption [Xiaohong et al., 2011]

M2. Zero tillage management. Zero tillage methods effectively mitigate climate change by
 enhancing and/or maintaining organic matter in the soil, which lowers greenhouse gas emissions
 [Mangalassery et al., 2015]

M3. *Renewable energy use*. The agricultural sector can actively mitigate climate change by using manure as an alternative to fertilizers and by converting agricultural crops and waste into energy to reduce reliance on non-renewable sources (e.g., through biomass production) [Liu et al., 2017].

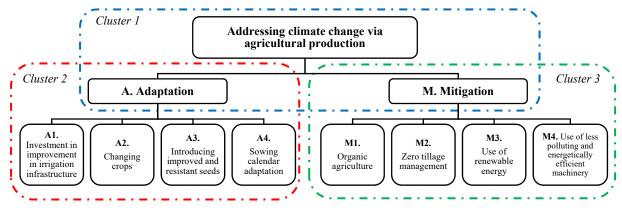
M4. Use of less polluting and energy efficient machinery. While greenhouse gas emissions are generally attributed to the energy sector due to the use of fossil fuels via agricultural machinery such as tractors, irrigation pumps, etc., the use of less polluting agricultural machinery can help mitigate impacts of climate change [Yue et al., 2017].

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270 *2. Structuring a decision model as a hierarchy.* Our hierarchical scheme (Figure 3) prioritizes 271 main criteria (adaptation and mitigation) and sub-criteria (actions) based on what is most accepted 272 according to farmers' preferences.

- 273
- 274





275 276 Figure 3. Decision hierarchy model and identification of clusters that form the decision hierarchy model

277 Stage 2. Assessment.

278 This stage corresponds to the third phase in the empirical application of the AHP: 3) model 279 evaluation through paired comparisons of all elements of each cluster level (Figure 3) using the verbal 280 scale of paired comparisons proposed by Saaty (Table 1), from which the relative importance of 281 alternative actions is then estimated.

Degree of importance	Scale definition
1	Both criteria are of the same importance. The two compared elements contribute equally to the fulfillment of the parent node.
3	The preferred criterion is slightly more important than the other.
5	The preferred criterion is moderately more important than the other.
7	The preferred criterion is much more important than the other.
9	The preferred criterion is significantly more important than the other.
2, 4, 6, 8	Judgments are made to define the relative importance of compared elements.

282 Table 1. Verbal scale used for paired comparisons. [Saaty, 1997]

283

284 For the upper cluster level, only one pairwise comparison is applied $[n \times (n-1)/2 = 2 \times (2-1)/2 = 1]$ 285 on adaptation and mitigation actions. For each of the lower level clusters according to dimension n =286 4 (4 alternatives actions), 6 pairwise comparisons are used $[n \times (n-1)/2 = 4 \times (4-1)/2 = 6]$, where each 287 alternative of the hierarchy is compared to the remaining alternatives within its cluster at the same 288 hierarchical level depending on the satisfaction it provides to the respondent (farmers). Pairwise 289 comparisons were collected using the scheme outlined below (Table 2):

on of measures (<i>cluster 1</i>) M. Mitigation Measures							
otation actions (<i>cluster 2</i>)							
A2. Change in crops							
1 2 3 4 5 6 7 8							
A3. Introduce improved and resistant seeds							
1 2 3 4 5 6 7 8							
A4. Adaptation of the sowing calendar							
1 2 3 4 5 6 7 8							
A3. Introduce improved and resistant seeds							
1 2 3 4 5 6 7 8							
A4. Adaptation of the sowing calendar							
1 2 3 4 5 6 7 8							
A4. Adaptation of the sowing calendar							
1 2 3 4 5 6 7 8							

291 Table 2. Paired comparisons included in the questionnaire

							-		-		-					
		M1	. Orga	nic agr	icultur	·e				M2	2. Zero	tillage	manag	gement		
9	8	7	6	5	4	3	2	1	2	3	4	5	6	7	8	9
M1. Organic agriculture										M.	3. Use	of rene	wable	energy		
9	8	7	6	5	4	3	2	1	2	3	4	5	6	7	8	9
M1. Organic agriculture							M4. Us	se of les		ıting aı machiı		getical	ly effic	ient		
9	8	7	6	5	4	3	2	1	2	3	4	5	6	7	8	9
		M2. Z	ero till	lage ma	anagen	ıent				M.	3. Use	of rene	wable	energy		
9	8	7	6	5	4	3	2	1	2	3	4	5	6	7	8	9
M2. Zero tillage management							M4. Us	se of les		iting ai machii		getical	ly effic	ient		
9	8	7	6	5	4	3	2	1	2	3	4	5	6	7	8	9
		M3. U	J se of r	enewa	ble ene	rgy			M4. Us	se of les	•	iting ai machii		getical	ly effic	ient
9	8	7	6	5	4	3	2	1	2	3	4	5	6	7	8	9

297 Stage 3. Prioritization and synthesis.

298 This phase involves 4) synthesis to identify the best alternative and 5) the examination and 299 verification of a decision that corresponds to the last two activities of the hierarchical analysis process 300 from which priorities (i.e., the relative importance) are estimated.

301

302 4. Synthesis to identify the most preferred criteria. For this activity, the joint prioritization of all 303 sub-criteria proposed in the model to select the one that addresses a given problem is carried out; to 304 this point, all comparisons must be drawn between elements of each cluster for each farmer k, from 305 which the corresponding Saaty matrices are obtained (\hat{A}_k) , through which local weights of the identified elements are obtained \hat{w}_{ik} according to the preferences of each farmer using the Row 306 307 Geometric Mean Method (RGMM) [Kallas and Gil, 2012].

The estimation of priorities (\hat{w}_{ik}) was carried out using Super Decisions software [Super decision, 2018] designed for the implementation of the AHP methodology. An example of results of pairwise comparison called judgments (\hat{a}_{ijk}) for farmer k in cluster 2 referring to adaptation measures is shown in Table (3).

312 **Table 3.** Example of the calculation of weights based on paired comparisons corresponding

313 to cluster 2, adaptation (A) attributes for individual k = 1.

Functions	A1*	A2*	A1*	A3*	A1*	A4*	A2*	A3*	A2*	A4*	A3*	A4*
Judgment (âij)	9		9		9		2		2			2
	â ₁₂ =9	â21=1/9	â13=9	â ₃₁ =1/9	â14=9	â41=1/9	â23=2	â ₃₂ =1/2	â ₂₄ =2	â42=1/2	â ₃₄ =1/2	â43=2

- 314 A1*. Investment in the improvement in irrigation infrastructure
- 315 A2*. Change in crops

316 A3*. Introducing improved and resistant seeds

317 A4*. Adaptation of the sowing calendar

318

All judgments (\hat{a}_{ijk}) obtained from the pairwise comparison lead to the construction of a Saaty

320 matrix for farmer k (\hat{A}_k) with dimensions (n x n = 4x4) as follows:

$$\hat{A}_{k} = \begin{bmatrix} a_{1.1k} & a_{1.2k} & a_{1.3k} & a_{1.4k} \\ a_{2.1k} & a_{2.2k} & a_{2.3k} & a_{2.4k} \\ a_{3.1k} & a_{3.2k} & a_{3.3k} & a_{3.4k} \\ a_{4.1k} & a_{4.2k} & a_{4.3k} & a_{4.4k} \end{bmatrix}$$

322 For the example shown in Table 3, the Saaty matrix is:

$$\hat{A}_{k} = \begin{bmatrix} 1 & 9 & 9 & 9 \\ 1/9 & 1 & 2 & 2 \\ 1/9 & 1/2 & 1 & 1/2 \\ 1/9 & 1/2 & 2 & 1 \end{bmatrix}$$

323

321

Based on the Saaty matrix, the relative importance (i.e., the weights or priorities) of different actions $\hat{W}_{nk} = (\hat{w}_{1k}, \dots \hat{w}_{nk})$ are estimated using the RGMM:

$$\hat{W}_{ik} = \sqrt[\eta]{\prod_{i=1}^{i=n} \hat{a}_{ijk}}$$
(1)

326 The previously estimated weights are normalized to the unit.

$$\sum_{i=1}^{i=n} \hat{w}_{ik} = 1$$
 (2)

5. Examination and verification of the decision. As part of the verification stage, it is important
 to note that for each generated matrix, the Consistency Ratio (CR) of farmers' answers was calculated
 according to corresponding mathematical expressions:

$$CR=CI/RI;$$
 (3)

330 where CI is the Consistence Index obtained as:

$$CI = \frac{\lambda_{max} - n}{n - 1} \tag{4}$$

331 where n= is the number of alternatives and λ_{max} is the maximum value of components of the 332 eigenvector obtained as:

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$$\lambda_{\max} = \sum_{i} \sum_{j} \hat{a}_{ijk} \hat{w}_{ik}$$
(5)

RI is the Random Index, which is obtained by multiple random extractions of the Saaty matrix of size n x n (Table 4).

Table 4. Values of the random consistency index (RI) based on the size (n) of the matrix.
[Saaty, 1994]

n	1	2	3	4	5	6	7	8	9	10
RI	0.00	0.00	0.58	0.90	1.12	1.24	1.32	1.41	1.45	1.49

337

A value of CR lower than 10% indicates satisfactory consistency for the pairwise comparisons

[Siraj et al., 2015]. The AHP is also considered a valid technique for the analysis of group decisions
 [Easley et al., 2000]. Thus, to obtain an averaged aggregated of different mitigation and adaptation

341 measures for the sample, corresponding individual weights (\hat{W}_{ik}) were aggregated across farmers to

342 obtain a synthesis of weights for each set of criteria (\hat{W}_i). The aggregation was carried out using the

343 Geometric Mean (GM) procedure, which is considered the most suitable method for aggregating 344 individual priorities in a social collective decision-making context [Forman & Peniwati, 1998]:

$$w_i = \sqrt[K]{\prod_{k=1}^{k=K} w_{ik}} \quad \forall i$$
(6)

345 2.3 New Ecological Paradigm (NEP) Scale

346 According to Hawcroft and Milfont, environmental attitudes can be observed through 347 psychological tendencies expressing positive or negative evaluations of the natural environment and 348 that cannot be observed directly and thus it must be inferred. Numerous tools allow one to measure 349 environmental attitudes, among which three psychometric tools are highlighted: The Ecology Scale, 350 The Scale of Environmental Concern and The New Ecological Paradigm. The first two scales refer 351 to very specific environmental issues, while the NEP scale, which is the most widely used, allows 352 one to measure general beliefs based on relationships between humans and their environments 353 [Hawcroft and Milfont, 2010].

According to some studies, farmers' beliefs regarding environmental issues can be measured using the NEP scale. This scale analyzes relationships between subjects' beliefs about themselves and nature. The scale reflects the ways in which humans conceptualize nature and interact with it (Vozmediano & Guillen, 2005; Dunlap et al., 2000; Lezak & Thibodeau, 2016].

In this study, farmers' preferences regarding climate change adaptation and mitigation actions
were analyzed in relation to their environmental beliefs measured through the NEP scale.
Predominant latent environmental dimensions of farmers could then be identified. The NEP scale was
presented to farmers with an array of statements using a 9-point Likert type scale (Table 5).

362 Individuals' views of the environment can be revealed from their perceptions and attitudes. 363 Using the NEP scale, an exploratory factorial analysis (Principal Component Analysis, PCA) was 364 performed to identify the dimensionality that characterizes farmers by associating the scale's items 365 with several independent dimensions. The identified dimensions allowed us to define latent factors 366 that are present in the participants' environmental attitudes [Gomera et al., 2013]. An exploratory 367 factor analysis (PCA) was carried out with Varimax rotation and using the Statistical Package for the 368 Social Sciences (SPSS, version 23.0). Before carrying out the factorial analysis, the Kaiser-Meyer-369 Olkin sample adaptation measure (KMOS) was applied.

Fully disagree	Strongly disagree	Moderately disagree	Slightly disagree	Neutral	Slightly agree	Moderately agree	Strongly agree	Fully agree	
1	2	3	4	5	6	7	8	9	
1. Th	e global ecol	ogical crisis has	been exagg	gerated					
2. Th	e balance of	nature supports	the impacts	of indust	rialized co	untries			
3. Hu	mans may b	e able to control	nature						
4. Hu	Human ingenuity will ensure that the earth will not become uninhabitable								
5. Hu	Humans were created to dominate nature								
6. Hu	mans have the	he right to modi	fy the envir	onment ar	nd adapt it	to their needs			
7. Hu	ıman interfer	ence in nature w	vill have dis	astrous co	onsequence	es			
8. Pla	Plants and animals have the same rights to exist as human beings								
9. Hu	mans have s	eriously damage	ed the enviro	onment					
10. Th	e balance of	nature is delicat	e and easily	v alterable					
11. If t	hings contin	ue as they have,	we will soo	on experie	ence a sign	ificant ecologic	al catastrop	ohe	
12. W	e are approac	hing the earth's	limit in terr	ms of sust	aining the	global human p	oopulation		
13. Th	e earth has li	mited resources							
14. De	spite our spe	cial abilities, hu	man beings	are still s	subject to t	he laws of natu	re		
15. Th	e land has ab	oundant resource	es, and we ju	ust need to	o learn to e	exploit them			
16. Su	stainable dev	elopment must	apply a bala	anced app	roach that	controls industi	rial growth		
	•	ding to Gom analysis sh		· · ·					

Table 5. Statements of the New Ecological Paradigm Scale

application of factorial analysis should reveal five dimensions 1) a component related to
anthropocentrism, 2) an ecocentric component, 3) limited consciousness, 4) a component related to
human confidence in nature and 5) a last component related to perceptions of infinite natural
resources.
The first identified component is referred to as anthropocentrism and was measured with

affirmations focused on the supremacy of humans over nature. The second component, the ecocentric dimension, was measured with statements focused on the unbalanced state humans have created in nature. The third component reflects consciousness regarding the existence of a limit on nature related to resources of the biosphere. The fourth component measures confidence in human to manage natural resources correctly. The last component reflects perceptions of infinite natural resources and thus humans' indifference to their consumption given the presence of abundant natural resources.

385 2.4 Stated risk attitude: The lotteries approach

372 373

The stated risk attitude level is related to human behavior, which is specific to each individual decision maker. Individuals prefer options that ensure more utility based on their risk preferences [Mejía, 2015; Brick et al., 2011; Galarza, 2009]. Several methodological approaches have been developed to measure individuals' stated risk attitudes and their relations to actions under a certain degree of uncertainty.

The Multiple Price List (MPL) or "lotteries" have recently been used in agriculture based on the theory of the expected utility u (x) and strength of risk preferences v (x) with the "True Equivalent" used to measure attitudes toward risk [Pennings & Garcia, 2001; Jianjun et al., 2015; Orduño et al. 2018]. The MPL method allows one to identify levels of risk tolerance or aversion through a set of questions posed to decision makers and in our case to farmers. The method examines 8 scenarios with different lottery pairs where one lottery option (option A or option B) is chosen [Drichoutis & Lusk, 2012; Brick et al., 2011].

The level of risk aversion is based on the number of safe answers (option A) the interviewed farmer selects. A farmer who is risk tolerant selects a risky option (option B) for the first scenario. A farmer who is risk neutral selects option A for the first 3 scenarios and selects option B for the remaining scenarios from (4-8 scenarios) while an extremely risk averse farmer selects option A for all 8 scenarios [March et al., 2014]. In the model, the safe option (option A) corresponds to a 100% probability of succeeding, and the risky option (option B) corresponds to a 50% probability of
obtaining \$100 and a 50% probability of obtaining \$0 (based on a coin toss) in all scenarios. Amounts
provided by option A are progressively decreased across all 8 scenarios to the following amounts:
\$00, \$75, \$60, \$ 50, \$40, \$30, \$20, and \$10. The experimental design structure of the risk elicitation
question is illustrated in the questionnaire available in the supplementary file Q_1v2 (Question 35).

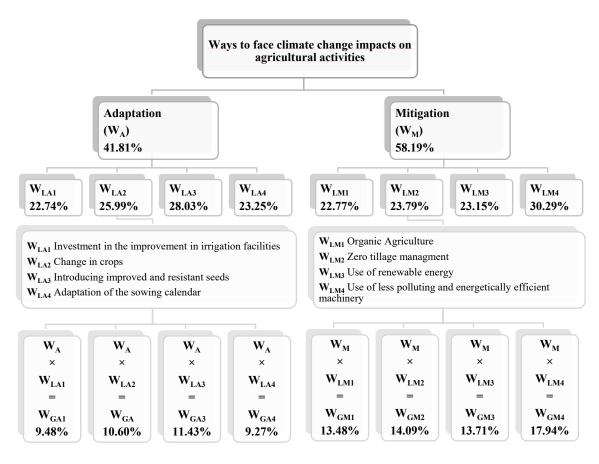
408 2.5 Hypotheses analyzed

409	Based on the above literature, the below hypotheses are tested:
410	1. H1: Farmers' estimated preferences regarding climate change adaptation and mitigation
411	(AHP) are related to their attitudes and opinions regarding the environment (NEP scale).
412	2. H2: Farmers' preferences regarding climate change adaptation and mitigation (AHP) are
413	related to their stated risk attitudes (MPL lotteries).
414	3. H3: Farmers' preferences regarding climate change adaptation and mitigation (AHP) are
415	related to socioeconomic and farm characteristics.
416	
417	All the above hypotheses were tested through an analysis of variance using the ANOVA method.
418	Preferences regarding climate change adaptation and mitigation were related to the two main latent
419	factors (ecocentric and anthropocentric) defined from the NEP via factorial analysis (PCA).
420	
421	

422 **3. Results**

423 3.1 Farmers' preferences for adaptation and mitigation actions

The estimated average weighting of adaptation and mitigation actions based on the AHP is presented in Figure 4. The results reflect farmers' prioritization of different ways to face the impacts of climate change on their activities. Weights (i.e., relative importance) were estimated at the local (i.e., for each cluster from local weights) and global levels (i.e., for the hierarchy level from global weights).



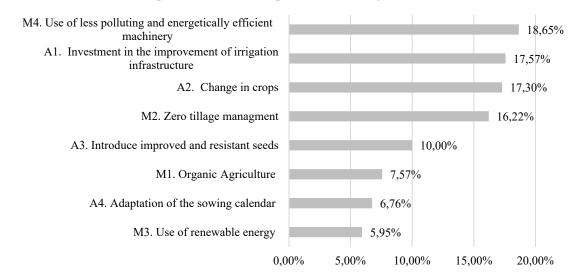
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Figure 4. Average relative relevance weights determined by AHP analysis according to farmers'
opinions (WA: local weight of adaptation measures group, WM: local weight of mitigation measures
group, WLA: local weight of a specific (n) adaptation measure, WLM: local weight of a specific (n)
mitigation measure, WGA: global weight of a specific (n) adaptation measure and WGM: global
weight of a specific (n) mitigation measure).

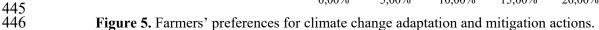
The estimated average weights show that mitigation actions were deemed the most important
options with a higher relative relevance of 58.18%. For each farmer we then estimated actions deemed
the most preferred (Figure 5).

According to the farmers' preferences, which were identified from the global weight of each individual farmer, the use of less polluting machinery was the most preferred action. The second most preferred action was investment in the improvement in irrigation infrastructure (17.57%). The changing of crops was deemed the third most preferred action, accounting for (17.30%) of the farmers' answers. Zero tillage management was the fourth most preferred action (16.22%).

The use of renewable energy was the least preferred option and was selected by 5.95% of the farmers.



Farmers' preferences for adaptation and mitigation actions



3.2 H1: Relations between environmental attitudes and farmers' preferences for climate change adaptation and mitigation actions

449 According to the results of our first PCA applied to items of the NEP scale, with a KMOS of 450 0.747 indicating that the reduction in dimensionality is relevant, the variability explained by the model 451 with 5 components is 67.11%. For this PCA, the first component included items 10, 11, 12, 13, 14 452 and 16 on ecocentric attitudes. The second component grouped items 2, 3, 4, 5, 6 and 8 related to an 453 anthropocentric attitude, among which item 8 is negatively related. The last three components 454 correspond to one or no significant item with relatively low percentages of explained variance. 455 Furthermore, items 1 and 7 do not contribute significantly to any component. Another PCA was then 456 carried out on the 12 items related to the anthropocentric and ecocentric dimensions. In this case, the 457 KMOS test generated a result of 0.754 and the variability explained by the factorial analysis of the 458 two 2 components was measured as 52.98%. This reduction in the NEP scale allowed for a better 459 definition of components by clearly differentiating the regrouping of item 8 with attitudes related to 460 an ecocentric attitude.

461

462 **Table 6**. Grouped reduced NEP scale according to each item's contribution to the new 463 components

Factor 1 Ecocentric Cent	New ecological paradigm scale items
0.81 -0.0	11. If things continue as they have, we will soon experience a significant ecological catastrophe
0.78 0.0	10. The balance of nature is delicate and easily alterable
0.69 0.1	14. Despite our special abilities, human beings are still subject to the laws of nature
0.63 0.1	12. We are approaching the earth's limit in terms of sustaining the human population
0.63 0.2	16. Sustainable development must apply a balanced approach that controls industrial growth
0.59 -0.1	8. Plants and animals have the same rights to exist as human beings
0.52 0.4	13. The earth has limited resources
0.00 0.8	3. Humans may be able to control nature
0.06 0.7	4. Human ingenuity will ensure that the earth will not become uninhabitable
0.04 0.7	5. Humans were created to dominate nature
0.04 0.7	6. Humans have the right to modify the environment to adapt it to their needs
0.16 0.7	2. The balance of nature supports the impact of industrialized countries
with Kaiser.	Extraction method: PCA. Rotation method: Varimax standardization w
52.98%	Total explained variance

464 Ecocentric and anthropocentric environmental attitudes

The farmers' distribution according to the reduced NEP scale can be observed in Figure 6. Two
main relevant behaviors are identified: ecocentric and anthropocentric environmental attitudes.
Accordingly, each farmer is positioned within two principal axes representing the main factors.

Four potential positions are specified in four quadrants: quadrant (+ eco, +anthro) corresponds
 to farmers agreeing with both attitudes in favor of nature and in favor of humans' priorities in using
 natural resources. This space may represent inconsistencies between farmers regarding their attitudes
 towards the environment.

For this same context, quadrant (-eco, -anthro) may also reflect farmers' inconsistencies regarding their stated opinions towards the environment, highlighting their disagreement with views that place nature above humans and with those that place humans above nature.

475 Quadrant (- echo, + anthro) refers to farmers who agreed with anthropocentric attitudes but 476 disagreed with ecocentric views, thus representing farmers who believe that humans are above nature 477 and that there is therefore no limit to the use of natural resources. The protection of nature in this case 478 should only be aim at enhancing the quality of human life.

Finally, quadrant (+eco, - anthro) groups farmers who agreed with ecocentric attitudes and showed disagreement with anthropocentric behaviors. These farmers believe that nature should be protected because it is vulnerable to the actions of humans and that humans must limit its use and perform actions that support nature.

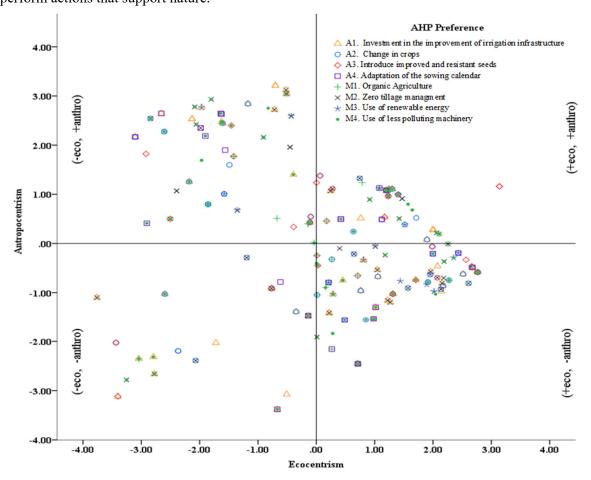


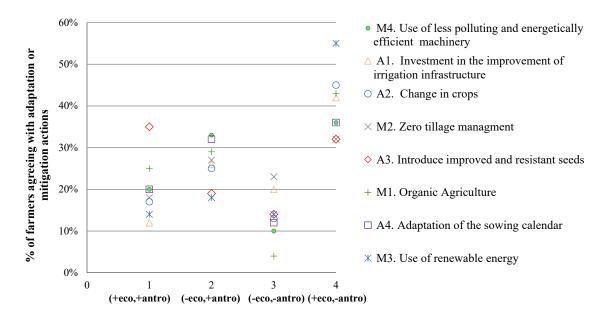
Figure 6. Farmers' distributions on the reduced NEP scale, ecocentric and anthropocentric dimensions,
 and relations to farmers' preferences for climate change adaptation and mitigation actions. +eco denotes
 that farmers agree with ecocentric attitudes, -eco denotes that farmers disagree with ecocentric attitudes,
 +anthro denotes that farmers agree with anthropocentric attitudes, and -anthro denotes that farmers
 disagree with anthropocentric attitudes.

The farmers' distribution on the abovementioned four quadrants shows that the majority (39%) exhibited a clearly positive ecocentric attitude (+ eco, - anthro), highlighting positive views of the environment in the studied region. However, 27% of the farmers exhibited a clear anthropocentric attitude (- echo, + anthro) and an interest in protecting nature only if for a clear economic benefit. The remaining farmers exhibited less clearly defined opinions regarding the environment where 15% exhibited negative views toward ecocentric and anthropocentric attitudes (- eco, - anthro) while 19% exhibited positive views toward ecocentric and anthropocentric attitudes (+ eco, + anthro).

The two abovementioned factors are related to farmers' preferences towards mitigation and adaptation actions obtained from the AHP. The results (Figure 7) show that the ecocentric and anthropocentric dimensions are closely related to the farmer's preferences. The mitigation and adaptation actions presented in Figure 7 are ordered according to their relative importance as discussed in Figure 6. An interpretation of the results shown in Figure 7 must be carried out horizontally by comparing the relative importance (%) of each action across the four quadrants.

The most preferred climate change adaptation and mitigation action (the *use of less polluting and energetically efficient machinery*, M4) was principally selected by farmers who exhibited a positive view of the environment (+eco, -anthro). The remaining mitigation and adaptation actions were also more important for farmers exhibiting more ecocentric views of the environment (+eco, -anthro). As an exception, one action (*to introduce improved and resistant seeds*, A3) was preferred more by farmers that do not exhibit a clear attitude toward the environment (+eco, +anthro).

508 The results listed vertically in Figure 7 show that farmers with the most ecocentric attitudes (+ 509 eco, -anthro) exhibited the strongest preferences for *the use of renewable energy* (M3).





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Figure 7. Farmers' distribution by preferences according to a combination of their positive or negative views of ecocentric and anthropocentric attitudes (4 quadrants).

513 3.3 H2: Stated risk attitudes and farmers' preferences for climate change adaptation and 514 mitigation actions

The MPL results regarding stated risk attitudes show that 51.35% of the farmers are risk averse, 516 7.57% are neutral, and 41.08% are risk tolerant. The heterogeneity analysis shows that the stated risk 517 attitudes and farmers' preferences for adaptation and mitigation actions are not clearly related. 518 Through the analysis conducted, no significant relationship was found between preferences for 519 adaptation and mitigation actions and the stated risk level, though it is clearly related to other 520 socioeconomic and management variables for farmers.

522 3.4 H3: Farmers' preferences for climate change adaptation and mitigation actions and their 523 socioeconomic characteristics

Regarding the socioeconomic characteristics of the sample, most of the farmers surveyed were between 41 and 60 years of age (52%), followed by farmers over 60 years of age (28.38%) and those under 41 years of age. Only 11% of the agricultural producers were women, and the average number of family members was recorded as 3.78.

528 Our analysis of socioeconomic characteristics also shows that 76% of the participants' incomes 529 are generated from agricultural activities. Approximately, 68% of the producers had received a 530 subsidy mainly used (60%) to cover operating costs while 12.3% of farmers had applied it to invest 531 in agricultural equipment and technology. Most of the farmers (63%) do not usually use any type of 532 agricultural insurance. Most of the participants owned their agricultural land (79%), and the main 533 products grown included wheat (29%), alfalfa (24%) and soybeans (9.73%).

534 Socioeconomic characteristics measured related to preferred mitigation and adaptation actions 535 included the following: adopting contracted agricultural insurance, having credit for a farming land 536 tenure regime, belonging to an agricultural association, selection of crops, and farmer's age and sex.

537 The results for these variables show that farmers without crop insurance prefer the "change in 538 crops" measure, while those with insurance prefer "the use of less polluting and energetically efficient 539 machinery" to reduce the impacts of climate change. On the other hand, framers with crop insurance 540 have less concerns regarding the impacts of climate change and thus exhibit a preference towards 541 other actions that principally reduce negative effects on the environment.

542 Farmers with credit for farming activities and agricultural insurance and belonging to an 543 agricultural association prefer "the use of less polluting and energetically efficient machinery" and 544 grow onions, chili peppers, corn, soybeans, sorghum, and triticale. Furthermore, farmers without 545 credit for farming activity and with private property under a land tenure regime who grow sweet 546 potatoes prefer to increase investment in the improvement in irrigation infrastructure.

547 Mitigation action "zero tillage management" was preferred by farmers without credit for farming 548 activity, who do not belong to an agricultural association and principally grow watermelon and 549 cartamo.

550 Finally, farmers under 40 years of age prefer "investment in the improvement in irrigation 551 infrastructure," farmers 40 to 60 years of age prefer the "change in crop" approach, and farmers over 552 60 years of age prefer "zero tillage management."

553 4. Discussion

554 4.1 Farmers' preferences for adaptation and mitigation actions

555 Overall, the above results show that farmers in the study region prefer to implement mitigation 556 actions to address climate change. These results are in agreement with those obtained by Bragado 557 (2016), who found that mitigation actions are prioritized within the agricultural sector in addressing 558 climate change effects.

The most preferred action among the studied farmers involves the "use of less polluting machinery," which indicates that public policy decisions should focus on promoting the use of less polluting and highly efficient agricultural machinery. This outcome was also proposed by Xu and Lin, who recommend that local governments encourage the use of energy efficient, less polluting agricultural machinery to support environmentally friendly production [Xu & Lin, 2017].

564 Due to water scarcity, which it is becoming more frequent in the studied region, water 565 management agencies have been forced to frequently restrict volumes and periods of water use for 566 irrigation, subjecting crops to water stress [Ojeda et al., 2012] and causing farmers to prefer 567 investment in improving irrigation infrastructure. Investment in irrigation infrastructure increases 568 water use efficiency [Nelson, 2009] and may lead to a high degree of water loss. It is worth mentioning 569 that in the presence of poor irrigation infrastructure, more than 55% of water used is wasted [Sifuentes 570 et al., 2015].

571 Crop change (polyculture) methods exhibit more stability with less loss of productivity during 572 drought seasons because they allow crops to reach acceptable levels of productivity even under 573 unusual climatic conditions and environmental stress. Crop change can ensure a certain level of 574 productivity in the midst of climate change. The approach can also address future social and economic 575 needs as Altieri and Nicholls indicate [Altieri & Nicholls, 2009], corroborating our finding that 576 farmers favor such actions third in terms of their preferences.

577 Alternative zero tillage management was identified as the fourth most preferred mitigation 578 strategy among farmers in the study region. Lau, Jarvis and Ramírez (2011) and Nichols and Altieri 579 (2013) have also advocated for zero tillage as a feasible mitigation action [Lau et al., 2011; Altieri & 580 Nicholls, 2013].

581 All the above actions are closely related to economic benefits at the farm level. The adoption of 582 less polluting and efficient machinery reduces fuel oil consumption and thus reduces production costs. 583 Investment in irrigation infrastructure increases the productivity and quality of crops, optimizes the 584 use of water, and decreases water waste [Nelson, 2009 and Khanal et al., 2019]. Crop changes increase 585 productivity and decreases costs due to a lesser use of fertilizers and agrochemicals, which positively 586 affects farm productivity [Moniruzzaman, 2015 and Khanal et al., 2018]. The adoption of zero tillage 587 management reduces production costs, as it lowers tilling labor costs and may reduce the use of 588 chemicals and phytosanitary methods. Zero tillage methods are usually related to organic agriculture, 589 which may also increase the price of products [Kallas et al., 2010]. The use of renewable energy was 590 preferred least by the farmers corroborating studies showing the need for strong investment to 591 encourage the use of renewable energy facilities that may mitigate climate change [Kung & McCarl, 592 2018]. In general terms, farmers prefer options that minimize the impacts of climate change while at

593 the same time providing them a perceived benefit in the short run at the farm level.

4.2 H1: Relations between environmental attitudes and farmers' preferences for climate change adaptation and mitigation actions

Regarding farmers' environmental attitudes, which are described by Gomera et al. (2013) and Reyna et al. (2018) as ecocentric and anthropocentric environmental attitudes, and regarding farmers' preferences to mitigate or adapt to climate change, the most preferred action, "the use of less polluting and energetically efficient machinery," was selected by farmers with positive attitudes toward the environment.

601 As Hajjar and Kozak (2015) argue, ecocentrics might be interested in using more 602 environmentally sustainable technologies, while farmers without clear views on the environment 603 prefer "introducing improved and resistant seeds." For this adaptation measure, farmers may seek to 604 enhance their economic benefits through the implementation of a simple mitigation or adaptation 605 action without considering positive or negative effects on the environment. Ecocentric farmers 606 believing that nature should be protected showed the strongest preference for the use of renewable 607 energy and mitigation actions to face climate change. This group clearly exhibited the strongest 608 concerns regarding the environment and a clear tendency toward using more environmentally friendly 609 technology [Hajjar and Kozak, 2015].

4.3 H2: Stated risk attitudes and farmers' preferences for climate change adaptation and mitigation actions

612 Our risk level results show that most of the studied farmers were risk averse. This is at first 613 unexpected, as most of the studied farmers do not use agricultural insurance. However, our findings 614 are in line with those of Jianjun et al. (2015), who used MPL and found an unclear relation between 615 risk attitudes and preferences for climate change adaptation and mitigation [Jianjun et al., 2015].

According to Palm (1998), most risk-averse individuals tend to take preventive and protective
actions against potential damages [Lopez & De Paz, 2007]. Farmers in our study region were found
to be mostly risk averse, which would imply that they have a strong willingness to carry out actions
in favor of reducing the effects of climate change through adaptation or mitigation actions.

The non-significant relationship found between preferences for adaptation and mitigation actions and the stated risk level could be explained by the fact that all actions were identified by farmers as protective measures against potentially negative impacts of climate change. Preferences for adaptation and mitigation measures among farmers in the study region are also related to other variables concerning farmers' and farm characteristics and farmers' decisions made in relation to their activities [Orduño et al., 2018].

4.4 H3: Farmers' preferences for climate change adaptation and mitigation actions and their socioeconomic characteristics

628 Our results show that farmers without crop insurance preferred the "change in crops" adaptation 629 strategy, while those with insurance preferred "the use of less polluting and energetically efficient 630 machinery." This result may be attributed to the fact that a change in crops increases productivity and 631 thus insures farmers' incomes against impacts of climate change. This preference affords farmers 632 confidence in terms of having enough income to support their planting commitments [Altieri & 633 Nicholls, 2009].

634 Our findings show that farmers who do not need credit for their agricultural activities and who 635 grow potatoes prefer "investment in improving irrigation infrastructure," which may be related to the 636 fact that potato crops are very sensitive to a lack of water [FAO, 2008]. These preference patterns 637 show that farmers are more concerned with using water solution technologies to reduce the impacts 638 of climate change in the region. This same outcome was found for farmers under 40 years of age, 639 showing that young individuals are more sensitive to water use and waste [Rodríguez & Jiménez, 640 2014]. Farmers aged 40 to 60 years instead prefer the "change in crop" approach, which may be linked 641 to an interest in ensuring economic benefits. Finally, farmers over 60 years of age prefer "zero tillage 642 management," which could be associated with farmers' experience. The "zero tillage management" 643 approach is also preferred by farmers who grow watermelon and cartamo and who do not have credit 644 for their farming activities. This outcome could be related to the fact that watermelon and cartamo do 645 not require an extensive land preparation, thus rendering zero tillage methods a viable mitigation 646 option [Moreno et al., 2013; Valdez et al., 2012].

647 5. Conclusions

648 This study contributes to the literature by furthering available knowledge that can inform policy 649 makers regarding support and subsidies related to agricultural production that better meet framers' 650 needs and preferences. This may enhance the effectiveness of policy measures by stimulating 651 preferred actions that improve farmers' social and economic welfare. It may also guide current public 652 support to prioritize measures that promote the development of more sustainable agriculture activities 653 at regional and national levels. At the methodological level, this paper contributes to the few studies 654 jointly using the AHP in relation to farmers' preferences with the NEP scale and MPL risk approach, 655 particularly in reference to México.

To effectively face the impacts of climate change on agriculture implies the implementation of mitigation and adaptation actions according to farmers' interests and preferences. In general terms, farmers tend to prefer adaptation actions or mitigation actions because the former are perceived to offer benefits sooner when adopted. Farmers with ecocentric attitudes exhibited a greater willingness to adopt measures against climate change, while those with anthropocentric views principally exhibited stronger preferences for activities related to improvements in their productivity.

662 Through the Analytical Hierarchy Process, farmers were found to prioritize actions that 663 implicitly provide economic benefits over the short run. The use of efficient, less polluting machinery 664 was identified as one of the best alternative options not only due to its positive impacts on the 665 environment but also due to its economic benefits in terms of reducing energy costs at the farm level.

666 Our results show that farmers' preferences for mitigation and adaptation actions are closely 667 related to the types of crops cultivated. Investment in improving irrigation infrastructure as an 668 adaptation activity was widely accepted by farmers with water availability issues who grow sweet 669 potatoes. This adaptation action helps farmers optimize their water use and address water availability 670 issues in the region by increasing their productivity and limiting the water waste. Adopting a change 671 in crops grown as an adaption action was also preferred by farmers who grow sorghum. Also, a 672 preference for the zero tillage mitigation approach was found to be related to watermelon and cartamo 673 cultures.

Agricultural public policy decisions must consider farmers' preferences towards mitigation and
 adaptation actions when designing and implementing measures that ensure sustainable agriculture.
 Policy tools and interventions must be inclusive and developed at the micro-level based on farm

677 typologies, and crop diversity must be encouraged.

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679 Author Contributions: M.A.O.T conceived and designed the study, conducted analyses, collected data, and 680 wrote the manuscript; Z.K. conceived and designed the research study, reviewed and edited the manuscript and 681 supervised all procedures; S.I.O.H conducted the analysis and helped write the manuscript.

682 Funding: This research received no external funding.

683 Acknowledgments: The National Council of Science and Technology (CONACYT) is acknowledged for 684 supporting this research.

685 Conflicts of Interest: The authors declare no conflicts of interest.

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