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Ecosystem-Based Food Production: Consumers' Preferred Practices and Willingness to Buy and Pay

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Abstract: Ecosystem-based agricultural practices that utilize ecosystem processes aim to either reduce the negative externalities of agricultural production or increase the production of ecosystem services other than food provision. We examined consumer interest in buying and paying for food produced using ecosystem-based agricultural practices. According to the results, the most preferred practices were the more efficient use of livestock manure, the use of nitrogen-fixing crops, biological pest control, and the addition of soil carbon. Having these practices as an attribute of a food product increased the interest in buying the product for 43% of consumers. Their median willingness to pay (WTP) was 20% higher than for conventional products. Using socioeconomic and attitudinal variables, a hurdle model revealed the characteristics of a consumer segment interested in ecosystem-based agricultural practices.

Keywords: ecosystem services; contingent behavior methods; contingent valuation; consumer characteristics; organic production

1. Introduction

Two options to enhance agriculture that take into account the wide range of ecosystem services beyond just food are (1) the design of agri-environmental policies [1] (2) to leave the responsibility for the supply of these ecosystem services to the markets, where consumer choices reveal the demand for these services to producers [2]. These two options can also complement each other; part of the environmental concern is passed to producers via policy and part of it is passed through the demand for credence goods, such as organic foods. In this study, we focused on the possibilities of the latter option and analyzed the demand among Finnish consumers for cultivation practices that enhance ecosystem functions and reduce the negative externalities from agriculture.

The externalities of agricultural production affect the state of agricultural ecosystems and other ecosystems, such as water bodies, that, depending on their state, provide ecosystem services for humans [3,4]. Agricultural intensification may also lead to reductions in biodiversity and, consequently, negatively affect pollination by insects or biological pest control [5,6]. Enhancing ecosystem functions with ecosystem-based agricultural practices could solve some of these externalities, increase the supply of ecosystem services, and benefit crop production, for example by allowing a reduction in the use of synthetic fertilizers and pesticides [7].

Understanding consumer preferences for agricultural practices is important because they can provide possibilities to apply market-based approaches to solve the environmental challenges of production. Information on consumer preferences could influence agricultural practices directly or the ensemble of practices included in organic production [8,9].

In this study, we were interested in the consumer demand for agricultural practices that either reduce the external costs of agricultural production or increase the production of other ecosystem services than food. We went beyond the organic production label



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Copyright: © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). to consider actual agricultural practices. The practices we were interested in rely on enhancing ecosystem functions in crop production. We defined the characteristics for the consumer segments interested in each practice. Furthermore, we measured consumer willingness to purchase food products produced with these practices and willingness to pay for these products.

2. Previous Literature

It is generally foreseen that future growth in population and consumption, but also the rising role of bioenergy crops, will increase the global demand for agricultural products over the next decade [10]. Future production increases will have to come to a large extent from intensifying agriculture on existing agricultural lands [11]. The intensification is likely to cause reductions in biodiversity and a negative impact on natural resources on long run such as undesirable effects on pollination or biological pest control [12]. Understanding the dependences in the complex agricultural food systems is a necessity for the design of sustainable alternatives [13]. For example, to maintain functioning agricultural production systems, apt soil management measures are required to prevent soil degradation that could harm future agricultural production [10].

There are several terms and frameworks in literature to structure the discussion of the challenges of and solutions for producing more food at the same time as protecting natural resource base and environment. The concept of sustainable intensification (SI) recognizes the need for a productive and remunerative agriculture that also preserves and enhances ecosystem service provision [14–16]. SI for crop production has been discussed in several reviews e.g., [17–21]. According to FAO [22], SI in crop production can be achieved through good farming practices where farmers utilize knowledge of biological processes and manage ecosystems to improve productivity and sustainability of production systems. These ecosystem-based practices, refined on a local level, aim at meeting consumer needs for products that are of high quality, safe and produced in responsible way. Examples of ecosystem-based practices include conservation agriculture relying on the natural biological processes above and below the ground e.g., minimum mechanical soil disturbance and direct seeding, permanent organic soil cover, diversified crop rotations, crop-livestock systems, integrated pest management, integrated plant nutrient management, agricultural water management and pollination management.

From the point of view of consumer studies these ecosystem-based practices can be seen to produce credence goods. Credence goods [23] are most often private goods that sometimes have public good characteristics [24]. According to previous studies, consumers care about credence attributes with regards to environmental reasons as a primary driver of food purchase decisions [25–28]. However, in the previous literature, agricultural practices that enhance ecosystem functions by increasing ecosystem services and reducing negative externalities have seldom been used as a quality argument for credence goods as such. Typically, these characteristics are hidden behind labels, such as organic production.

Organic food has gained popularity and experienced steady growth over recent decades [29]. Organic crop production has clear criteria, but the combination of agricultural practices behind organic production has seldom been opened up in consumer studies. There has been criticism towards the content of organic production from the environmental point of view, as the environmental impacts per unit of production have been higher in organic than in conventional production [30–32]. As it is expensive for producers to follow all the criteria of organic production, it has been suggested that the agricultural practices of organic production could be selectively implemented and the products promoted as grown using ecological practices rather than being certified as organic [33].

Previous studies have demonstrated that if the demand for individual agricultural practices is examined separately, they are valued differently compared to the combination of practices labeled as organic [34]. For example, 'organic' production is more far-reaching than the pesticide-free attribute, since, among other restrictions, no synthetic pesticides can be used in organic production. However, the organic attribute has been found to be

less significant in the buying decision [34]. Previous literature on organic production has defined a segment of consumers that is interested in purchasing as well as a segment that is willing to pay for organic goods. The demand for organic foods has been examined and summarized in a meta-analysis of 33 studies [35] focusing on willingness to pay (WTP) for the organic attribute of a good. The analysis revealed that WTP is below 20% for half of consumers but female gender and household size are positively related to the demand for organic goods. The association with age has been described as an inverse U-shape.

The separate agricultural practices comprising organic production or environmentally friendly production have been tested from the viewpoint of consumer preferences in a small number of studies [26,33,36–39]. Typically, such studies have only focused on a single practice, which in most cases has been that related to pest management.

Khachatryan and Rihn [38] demonstrated that the plant type under cultivation influences the perceived importance of agricultural practices regarding pollination. For food crop plants, the practice 'grown without pesticides' was perceived as the best one for pollinator health, whereas the practice 'grown outside' was ranked the highest for landscape plants. The 'grown using synthetic pesticides' practice was ranked the least beneficial method by consumers, regardless of the plant type. Maples et al. [33] included a wider selection of agricultural practices in their evaluation as credence attributes for tomatoes. They found that consumers were willing to pay more for tomatoes grown using less water, containing lower levels of pesticide residues, grown with organic fertilizers, or transported over shorter distances to the final point of sale. Moser, Raffaelli and Thilmany-McFadden [34] reviewed previous results concerning fruits and vegetables produced with integrated pest management, showing that consumers who have previous knowledge of this topic are willing to pay a premium of six percent or higher [36,40].

In the following, we focus on the consumer preferences for ecosystem-based crop production practices. Our study questions are: (1) what are the practices that interest consumers, (2) how many consumers are interested to buy food produced with these practices and (3) how much they are willing to pay for it. Furthermore, (4) we are interested to reveal those socio-demographic variables that significantly associate with willingness to buy and pay for food produced with ecosystem-based practices.

Finnish consumers are well suited to examine these study questions as approximately 80% of the food consumed in Finland is also produced there. The share of domestic products is especially high in grain products, as on a typical year, the national production covers the consumption [41]. In addition, there is a need to develop organic production in Finland [42] with a potential to increase the share of consumed organic products (€50/person compared to €60/person average in Europe [43] while the share of active users of organic foods was 32% [44]. Understanding consumers' preferences towards different agricultural practices facilitates developing an organic label and helps to improve the desirability of organic food.

3. Data and Methods

3.1. Applied Methods

To identify the consumer preferences for agricultural practices that reduce negative externalities or produce more ecosystem services, we applied three methods (Figure 1).

First, we identified a selection of ecosystem-based agricultural practices that target externalities and ecosystem service provision. These practices needed to be well known and understandable for a layperson, and also feasible from the farmers' point of view. The nine selected practices were tested in stakeholder discussion with participants from the administration and NGOs (N = 6). The practices were further tested in a pilot survey (N = 202) and accepted for the final survey. In the final survey, we used the self-explicated approach (SEA) to define preferences for these ecosystem-based agricultural practices. SEA refers to a class of preference measurement approaches in which respondents directly evaluate the desirability of each attribute level, as well as the importance of the attributes [45,46]. In our case, the SEA consisted of one task where the respondents selected two to five attributes, i.e., agricultural practices, that they would like to have implemented for a food product.



With this approach, we avoided difficulty in ranking all the attributes and problems related to rating, i.e., the typical phenomenon of finding all the attributes to be important.

Figure 1. The correspondence between survey methods, the respondent's choice process and the statistical methods.

Since the possibilities to buy food products that limit externalities from agriculture and enhance ecosystem functions in Finland are restricted to organic products, purchasing behavior could not be examined in actual markets. Therefore, we secondly focused on consumers' buying intentions, which can be examined with the contingent behavior method (CBM). In the CBM, people are asked how they would behave in a particular new situation, for example if food products that enhance ecosystem functions were available. The method has earlier been used in the context of food purchasing. Previous examples of surveying buying intentions have included products such as organic, ethnic, or genetically modified food, agricultural genetic resources, and food labeling [47–50].

Third, the value of goods that are not available on the market can be examined with stated preference methods, such as the contingent valuation method (CVM) or a choice experiment [51]. Here, we selected the CVM, as for the number of attributes we included, a choice experiment would have been demanding to implement. A choice experiment was also impossible because of the respondent burden, as the survey already included an agri-environmental policy-related choice experiment [48]. In the CVM, which is typically applied in the environmental valuation of non-market goods, respondents are asked about their willingness to pay (WTP) for a specific good or service. Common elicitation formats include, for example, open ended question, payment card and single or double bounded dichotomous choice [52]. The effect of various factors on WTP can also be modeled. Applications related to agricultural products are less common in the literature [53]. Recently, however, the contingent valuation method has been more frequently used to measure consumer preferences for new products [54] and to determine the factors influencing the WTP for food products [50,55]. A discrepancy between hypothetical and actual payments, i.e., the hypothetical bias, is possible in WTP. The premiums elicited in an actual buying context have been found to be significantly lower than hypothetical premiums [56]. However, in the case of a new product that does not exist on the market, the hypothetical setting is the only feasible option to examine the demand. Beyond the average willingness to pay for a product, it is important to identify the consumer segments that are interested in the product and to define how different variables, such as consumer attitudes or socio-economic characteristics, influence the willingness to pay.

3.2. Data Collection

Survey data on ecosystem services from agricultural environments were collected using an Internet survey during the spring of 2016. The sample was drawn from the Internet panel of a private survey company, Taloustutkimus, which comprised 30,000 respondents who had been recruited to the panel using random sampling to represent the population [57]. After a pilot survey of 202 people, a random sample of 8391 respondents was selected, of whom 2066 completed the survey. This corresponds to a response rate of 25%. Based on the socio-demographic variables, the sample represented the Finnish population rather well.

3.3. Survey Questions

The survey first introduced the respondents to some basic facts concerning agriculture and related environmental issues. After questions concerning the perceived importance of ecosystem services and perceptions concerning the possibilities to provide them with agri-environmental policies, the survey contained a set of questions about using ecosystem processes to reduce externalities and enhance ecosystem services. The presented agricultural practices (9) were targeted at the following externalities and ecosystem services: soil fertility, pest and weed control, clean water/water purification, climate regulation, and maintaining natural diversity. The items included in the list are presented in Table 1. Three of these practices are required in the current conditions for organic production. Four of the practices are not required in organic production, but two of these are regularly applied and two occasionally in the present cultivation practices for organic production.

The next part of the survey focused on taking ecosystem functions into account in agricultural practices. First, respondents were presented with the following information: "There are several alternative ways to produce food. One of these alternatives is to enhance nature's own functions on fields to reduce the environmental effects of agriculture. Enhancing natural functions could provide benefits, for example, by allowing a reduction in synthetic fertilization and the use of pesticides." The respondents were then presented a list of agricultural practices of this kind in food production (Table 1).

Respondents were asked to select from two to five agricultural practices they would like to see implemented in food production (Figure 1). Thus, the selected practices defined the characteristics of food production in the CB and CV questions. In the CB question, the selected agricultural practices were defined as follows: "If the agricultural practices were used in food production as certified and this type of food was available, I would buy it: (a) only if it was cheaper than conventional food; (b) if the price was same as that of conventional food; (c) even if it was more expensive than conventional food; or (d) I would not choose this type of food."

Contingent valuation was implemented to include both positive and negative directions and a payment card approach was used as an elicitation format. If alternative A was chosen in the CB question, a respondent was asked how much cheaper this type of food should be compared to conventional food so that the respondent would buy it. The scale ranged from 10% to 70%, with 10% increments, also including the "I don't know" response. If alternative C was chosen, the respondent was asked how much more expensive this type of food could be at maximum compared to conventional food. Again, the scale ranged from 10% to 70%, with 10% increments, and the "I don't know" response was included. Percentages were used instead of euros as the product type was not specified.

After the CV questions, respondents were asked to provide background information.

Agricultural Practices in the Survey	Variable	Relation to Organic Production				
More efficient use of livestock manure instead of synthetic fertilizers in order to maintain land fertility	Livestock manure	In present conditions				
Use of nitrogen-fixing crops, such as clover and peas, as a complement to synthetic fertilization	Nitrogen-fixers	In present conditions				
Cultivation of mixtures of cereal crops to reduce the risk of pests and diseases and achieve a higher crop yield	Mixtures of cereal	Used regularly				
Use of ground preparation to reduce the use of herbicides	Less herbicides	Used regularly				
Use of biological control (e.g., insects, birds) for pests instead of chemical control	Bio-control	Used regularly				
Sowing without ploughing (direct sowing) to reduce nutrient emissions and maintain soil fertility	Direct sowing	Used occasionally				
Site-adapted use of fertilizers to enhance the protection of waters	Adapt fertilizer	Used regularly				
Addition of plant-based (carbon-containing) material to soil to mitigate climate change	Soil carbon add	Used occasionally				
Uncultivated diversity strips on the edges of the fields to diversify natural habitats (plants, birds, insects, small mammals)	Diversity strips	In present conditions				

Table 1. The agricultural practices from which respondents were asked to select two to five options they would prefer to be implemented in food production.

3.4. Statistical Analyses

We assumed that consumers have preferences for agricultural practices. These practices can be expected to increase consumer interest in buying the product and also increased the WTP for it. We assumed that consumers simultaneously make the buying decision and the willingness to pay decision for the product that complies with their preferred agricultural practices. We also assumed that the socioeconomic background, such as income, and attitudes of consumers influence their preferences for practices, as well as their willingness to buy and WTP. Furthermore, we analyzed whether the choice of agricultural practices is associated with interest in buying and WTP.

After descriptive analysis of the three dependent variables, statistical models were constructed. The modelling approach is presented in Figure 1. The selection of agricultural practices was explained with a logistic regression model. The responses for practices were classified as "Yes" for a person if any of the choices (2 to 5 choices) included the specific agricultural practice. Otherwise, the response was defined as "No". This logic was applied to each of the nine agricultural practices. Each practice response was modeled separately. We used 10-fold cross-validation to find the predictor set with the best prediction accuracy. For each model, we calculated prediction accuracies for each predictor combination. When the predictor set with the maximum accuracy was identified, the model was fitted using this final predictor set for the whole data.

The purchase decision and the WTP decision were modeled with a two-tier hurdle model [58]. As a first step (Hurdle 1), the overall willingness to buy measured with the CB question was modeled, and as a second step (Hurdle 2), the willingness to pay derived

from the CV question was modeled. For Hurdle 1, the response was classified as "Yes" if a person was interested in buying food "even with a higher price" in the chosen basket consisting of 2–5 agricultural practices. Otherwise, the response was defined as "No". We applied a logistic regression model to the whole set of potential predictors in Hurdle 1. In interval regression of Hurdle 2, we applied a parametric survival model of the form $T \sim \beta^T$ + $\sigma \varepsilon$, where $\varepsilon \sim N(0,1)$ and σ denotes the scale. *T* takes values of $(0, \infty)$, and its distribution is specified by a cumulative distribution function (in our case normal). The best set of predictors was found by separately maximizing the prediction accuracy for Hurdle 1 and Hurdle 2. Descriptive information on the predictors is presented in Table 2.

Variable **Distribution (Categoricals)** Importance: biodiversity 0.49 (ref. average or low) Importance: landscape 0.37Importance: climate 0.49 Importance: waters 0.68 Education (ref. elementary) 0.09 Vocational 0.22 High school 0.10College 0.20 University (applied sciences) 0.11 University 0.27 Farmer 0.02 Farmland owner 0.15 Gender female (ref. male) 0.45 Age <34 years 0.13 Lives in rural area 0.25 East or north Finland 0.23 Nature conservationist 0.11 Monthly income: no income (ref. no income) 0.03 under €500 0.02 €500-999 0.07 €1000-1499 0.10 €1500-1999 0.13 €2000-2999 0.28 €3000-3999 0.19 €4000-4999 0.08 €5000-6999 0.06 over €7000 0.02

Table 2. Independent variables in the models.

First, the hurdle model was fitted as a general model without adding information on the selected agricultural practices. Second, each practice was modeled separately with its own two-tier hurdle model. A model was separately fitted for each practice by adding a dummy variable (1) if a specific ecosystem service was chosen as a predictor (0 otherwise). In total, 9 models were fitted for the hurdle model.

4. Results

The descriptive results from the data indicate the preferences for various agricultural practices to enhance ecosystem services and reduce negative externalities. Table 3 presents the most frequently selected practices. These were related to the more efficient use of livestock manure instead of synthetic fertilizers, the use of nitrogen-fixing plants, the addition of soil carbon, and biological pest control (see Table 1 for detailed practices). The most preferred practices were thus associated with many ecosystem services, including water quality control, biodiversity, and climate regulation. No single ecosystem service had a dominant status among the preferred practices of the respondents.

Variable	% of Sample
Soil carbon add	58
Livestock manure	57
Nitrogen fixers	55
Bio-control	50
Diversity strips	42
Less herbicides	33
Direct sowing	24
Adapt fertilizer	24
Mixture of cereals	17

Table 3. Proportion of respondents who selected each agricultural practice.

Table 4 reveals the willingness to buy and pay figures for a product in which the agricultural practices enhance natural functions on fields to reduce the environmental effects of agriculture. Altogether, 43% of the respondents were interested in buying the product, even if it was more expensive than a conventional product. According to the WTP distribution, the median WTP was 20% higher than for conventional food. Bids of over 40% were made by less than one-tenth of all the respondents.

	Proportion of Respondents, %				
Willingness to buy					
Only if cheaper	2				
If the same price	54				
Even if more expensive	43				
Willingness to pay more					
10%	34				
20%	43				
30%	16				
40%	2				
50%	2				
60%	1				
70%	1				
80%	0				
90%	0				
100%	1				

Table 4. Willingness to buy and pay for a product produced with selected agricultural practices.

The logistic regression models for selecting each agricultural practice are presented in Table 5. The environmental attitudes show consistency in how various practices are associated with attitudes towards the externalities of agriculture: biodiversity, landscape, climate regulation, and water quality. Agricultural practices that were selected by those who perceived biodiversity as an important target were nitrogen fixers, using mechanical management instead of herbicides, biological pest control, direct sowing, and diversity strips. Landscape targets were associated with a preference for the application of livestock manure. This is understandable, as seeing livestock in the landscape has been one of the most important landscape attributes in previous studies [59]. The importance of climate targets was associated with selection of the soil carbon amendment practice. Those who considered water quality important also preferred biological pest control and the site-adapted use of fertilizers.

	Liveste Manu	ock Ire	Nitrogen	Fixers	Mixtur Cerea	e of als	Prepara Lower He Use	tion, rbicide	Biologica Contr	nl Pest rol	Direct Sc	owing	Site-Ada Use of Fer	apted tilizers	Addition Carbo	of Soil on	Diversity	Trips
Intercept	0.741	**	-0.202	*	-1.755	***	-1.346	***	0.089		-1.599	***	0.456	**	-1.952	***	-0.757	***
Importance: biodiversity			0.331	*	0.007		0.2580	**	0.469	***	0.267	**	-0.384	***	0.122		0.940	***
Importance: landscape	0.515	***			-0.086						-0.242	**			-0.229	*	-0.065	
Importance: climate					0.285	*	0.073						0.024		0.509	***		
Importance: waters	-0.125				-0.422	***			0.442	***			0.549	***				
Education (ref. elementary)																		
· Vocational	-0.261		-0.033		0.701	***	-0.336	*			0.296		0.005		0.331			
 High school 	-0.370	*	-0.028		0.635	**	-0.353				0.264		-0.002		0.373			
· College	-0.297		0.111		0.410		-0.474	***			0.150		0.107		0.458	*		
· University			0.071		0.400		0 = 4 4				0.000		0.070		0.404			
(applied sciences)	-0.309		0.071		0.488		-0.746	***			0.339		-0.373	*	0.401			
· University	-0.598	***	0.386	**	0.447	*	-0.657	***			0.231		0.291		0.264			
Farmer	-0.037										-0.728	*	-0.436		0.789	**		
Farmland owner	-0.097		0.245	*	0.241				-0.195		0.252				-0.611	***		
Gender female (ref. male)			0.028		0.143		0.215	**	0.104		-0.244	**						
Age < 34 years			0.020		012.20		0.849	***	0.002				-0.327	**	-0.329	*		
Lives in a rural area	0.031		0.464	***	-0.291	*	0.0.27		-0.231	**	0.466	***	-0.124		0.027			
East or north Finland	0.275	**			-0.004		0.358	***	0.202		-0.460	***	0.049		0.198		-0.173	
Nature conservationist	0.168				-0.265		0.141		0.469	***			-0.476	***	0.163		0.522	***
Monthly income: (ref. no)	01100				0.200		01111		0.105				0.1.0		01100		0.022	
· under €500	-0.413				0.532				-0.840	**	-0.394				0.725			
. 500–999	0.009				-0.044				-0.392		0.160				0.480			
· €1000–1499	-0.273				-0.092				-0.786	**	0.336				0.382			
· €1500–1999	-0.265				-0.537				-0.362		0.358				0.508			
· €2000–2999	-0.182				-0.207				-0.575	**	0.288				0.382			
· €3000–3999	-0.437				-0.079				-0.612	**	-0.119				0.423			
· €4000–4999	-0.217				-0.337				-1.044	***	0 251				0.524			
· €5000-6999	-0.615				0.408				-0.803	**	0.359				0.695	*		
• over €7000	-0.180				0.131				-0.748	*	0.521				1.032	**		
010101000	0.100				0.101				0.710		0.021				1.002			
No information rate	0.572		0.560		0.826		0.667		0.505		0.763		0.585		0.770		0.572	
Cross-validation accuracy	0.592		0.590		0.826		0.673		0.610		0.764		0.605		0.771		0.627	
LR test <i>p</i> -value	< 0.01		< 0.01		< 0.05		< 0.01		< 0.01		< 0.01		< 0.01		< 0.01		< 0.01	
Nagelkerke <i>R</i> ²	0.045		0.033		0.032		0.047		0.077		0.042		0.047		0.044		0.083	
Hosmer-Lemeshow GOF test	>0.05		>0.05		>0.05		>0.05		>0.05		>0.05		>0.05		>0.05		> 0.05	

Table 5. Preference for agricultural practices (*** *p* < 0.01, ** *p* < 0.05, * *p* < 0.1).

The choices of farmers and farmland owners differed significantly from those of the other respondents regarding certain practices. Farmers particularly supported the addition of soil carbon, whereas farmland owners supported plants that contribute to nitrogen fixation. Female and younger respondents especially preferred soil preparation to avoid the use of herbicides. Residence in a rural area was associated with the agricultural practices of cultivating nitrogen fixers and direct sowing. Regional differences were also found, as respondents from the eastern and northern parts of Finland supported livestock manure and the reduced use of herbicides. These preferences were associated with animal husbandry in these areas. A small group of respondents belonging to nature conservation organizations had some special characteristics in their preferences, as they supported biological pest control and biodiversity strips, agricultural practices that are especially

To summarize the results for interest in buying and WTP, we first present the hurdle models without defining the chosen agricultural practices (Table 6). Second, we summarize how the nine practices affected the two steps of the hurdle model (Table 7) if included in the model one by one. The interest in buying a food product produced with the selected practices was significantly and positively associated with environmental attitudes, especially those towards biodiversity and water quality. From the socio-demographic background variables, a university degree, being a farmer, living in the east or north of Finland, and belonging to a nature conservation organization increased the interest in buying. A higher WTP was only significantly associated with nature conservationists and farmers.

related to biodiversity. The preference for biological pest control was stronger among those

with the lowest income level.

	Step 1 Logistic Ro	egression	Step 2 Interval Ro	egression
Constant	-1.106	***	1.503	***
Importance of biodiversity	0.565	***	0.053	
Importance of water effects	0.334	***	-0.024	
Education				
Vocational school	0.068		0.040	
High school	-0.026		0.206	
Čollege	0.113		-0.252	
University (applied sciences)	0.431	**	-0.102	
University	0.419	**	0.053	
Farmer	0.631	**	0.945	***
East or north Finland	0.273	**	-0.070	
Nature conservationist	0.696	***	0.443	***
Log (scale)			0.236	
No information rate	0.561		0.430	
Cross-validation accuracy	0.611		0.431	
LR test <i>p</i> -value	< 0.01		< 0.01	
Concordance index	0.638			
Nagelkerke <i>R</i> ²	0.078			
Hosmer-Lemeshow GOF test	>0.05			

Table 6. Hurdle model for the interest in buying and WTP with no agricultural practices included in the model (*** p < 0.01, ** p < 0.05).

Table 7 reveals those agricultural practices that, if included in the hurdle model, increase the interest in buying and WTP. The effect on buying interest was highest for biological pest control, but the use of livestock manure, nitrogen fixers, and diversity strips also increased the interest in buying. WTP only significantly increased in the models for nitrogen fixers and the site-adapted use of fertilizers.

Ste	p 1	Step 2 Interval Regression			
Logistic R	egression				
В	Sig	В	Sig		
0.237	**				
0.213	**	0.197	**		
0.408	***				
		0.164	*		
0.240	**				
	Stej Logistic R B 0.237 0.213 0.408 0.240	Step 1 Logistic Regression B 0.237 ** 0.213 ** 0.408 *** 0.240 **	Step 1 Step Interval R Logistic Regression B Interval R 0.237 ** 0.213 ** 0.408 *** 0.240 **		

Table 7. Effects of agricultural practices in hurdle models if included one by one.

(*** p < 0.01, ** p < 0.05, * p < 0.1).

5. Discussion and Conclusions

The results of this study can be concluded as follows. Consumers are interested in agricultural production practices that reduce negative externalities and increase the provision of ecosystem services. The respondents were especially interested in soil management practices and practices improving biodiversity. The agricultural practices increased the willingness to buy, as 43% of respondents were interested in buying the product if produced by applying their selected practices, even if it was more expensive than conventional food products, and the median WTP was 20% higher than for conventional food.

Compared to the majority of previous studies that have focused on organic production practices as an entity, the strength of our analysis is that we allowed consumers to evaluate the ecosystem based practices separately instead of clustering the practices together under the organic label. Thus, our results are comparable to those few previous studies on consumer preferences that have differentiated agricultural practices, and some similarities were found. In a study by Maples et al. [33], soil-related practices, especially organic fertilizers, were emphasized. In our case, from among the agricultural practices, the use of nitrogen fixers especially increased the willingness to pay. Similarly to our results of high preferences for biological pest control, Maples et al. [33] observed that products containing lower levels of pesticide residues were preferred. In our results, the agricultural practice that increased the buying intention the most was the use of biological pest control.

The WTP for foods produced with the favored agricultural practices was on the level of the price premium for organic products if compared to previous international studies. In the meta-analysis of Xia and Zeng [35], the WTP for the organic attribute of a food product was around 20%. Compared to consumers' interest in buying organic products in Finland, the results here indicated slightly lower interest (luomu.fi). The median price premium of 20% was also lower than the actual price premium of organic grain products in Finland. However, compared to the price premium of 6% for a single agricultural practice reported in Moser, Raffaelli, and Thilmany-McFadden [34], the combination of two to five practices that consumers selected had a higher price premium, as could be expected.

In our study, we aimed at expressing the agricultural practices in such a way that a layperson could understand them. Nevertheless, with our survey-based method, we could not be sure whether the respondents were familiar with all the practices we introduced or guarantee that the respondents would be fully aware of the meaning and the impacts of all the proposed agricultural practices. Awareness of the methods most probably relates to the higher interest among nature conservationists and farmers in buying the products and paying for them. This is in line with the finding of Govindasamy and Italia [36] and Cranfield and Magnusson [40] that previous knowledge of the topic increases the price premium.

We defined the characteristics of the segment of consumers interested in practices enhancing ecosystem functioning. Having a high intention to buy was more easily profiled than having a high willingness to pay. Unlike studies on organic production, we did not find a positive relationship between a respondent's female gender or age and buying intentions [35]. In our case, a high level of education, residence in the east or north of Finland, and being a farmer or nature conservationist increased the demand. Furthermore, positive attitudes toward ecosystem services and low externalities from agricultural lands increased the demand. These results provide some information for producers to assist them in finding the segment of interested consumers, as well as an opportunity to differentiate their products from other products based on the production methods used. As no ready label exists for these production methods, local markets that facilitate close communication between consumers and producers are possible alternatives to reach interested consumers.

One possible weakness of our study was that mimicking the consumer decision process in a survey was rather inflexible. In our approach, three decisions were made by the consumers, one after another, concerning the choice of preferred practices, interest in buying, and WTP. We assumed that the choice of the practices was made separately but, in reality, all the three choices would most probably be made simultaneously. Integrating the decision would, however, considerably complicate the statistical analysis. Therefore, in our case only two of the decisions, buying and paying, were integrated in modelling, and the choice of practices was analyzed separately.

As our focus went beyond the organic production label to actual agricultural practices, our results are applicable in the development of organic production if there is interest in revising the conditions of organic production. According to the results, three out of the five agricultural practices most preferred by the consumers are currently part of the requirements in organic production. However, the results demonstrated how organic conditions may be extended to better correspond to consumer expectations: soil carbon amendment, which is not part of the current requirements, was a practice that interested consumers. In addition, the use of biological pest control was appealing to consumers, and even though it is used in vegetable production, it could also have a stronger role in other organic plant production.

From the agricultural practices regularly or occasionally used in organic production, ground preparation reducing the use of herbicides and direct sowing are practices that cause especially high expenses for farmers and thus partly limit their shift to organic production. However, according to the results of this study, they may not be particularly important to consumers. It would be very interesting in future research to focus on some of the agricultural practices and compare in more detail the results for consumer demand with information on the production costs for farmers.

These empirical results of consumer preferences for various production methods also has importance for international processes of developing criteria for organic production, although more empirical studies on consumer preferences are needed from other countries. Following the approach of our study, but focusing on regionally relevant agricultural practices, would widen the knowledge base of defining organic practices. Together with information on the environmental effects of various production methods, this would lead to more science-based development of the content of organic production.

The study generated ideas to continue research in the future. New empirical studies from different regions and other management practices are needed. The focus of this study was on plant production. However, revealing the preferences for environmentally friendly animal production and measuring consumer interest in buying and willingness to pay would be an interesting topic for future studies. Furthermore, more studies are needed concerning consumers' awareness of management practices. In a survey research the assumption is that consumers can process very concise information on production methods. Involving consumers more in depth in planning the management practices in real life food production processes would reveal new aspects concerning their knowledge and preferences.

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