



Assessing Consumer Preferences and Intentions to Buy Edamame Produced in the U.S.

Renata C. V. Carneiro^{1†}, Tiffany A. Drape², Clinton L. Neill^{3†}, Bo Zhang⁴, Sean F. O'Keefe¹ and Susan E. Duncan^{1*}

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> *Correspondence: Susan E. Duncan duncans@vt.edu

[†]Present addresses:

Renata C. V. Carneiro, Department of Chemistry and Fermentation Sciences, Appalachian State University, Boone, NC, United States Clinton L. Neill, Dyson School of Applied Economics and Management, Cornell University, Ithaca, NY, United States

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¹ Department of Food Science and Technology, Virginia Tech, Blacksburg, VA, United States, ² Department of Agricultural,

Due to the growing consumer demand for edamame (vegetable soybean) in the U.S., the domestic production of this specialty crop has been promoted in several Mid-Atlantic and Southeast states as an economically attractive alternative to replace the decreasing tobacco production. For the edamame agrobusiness to be successful in the U.S., consumer studies are as needed as new commercial cultivars that are developed for the U.S. environment. Thus, in this exploratory study, we investigated consumers' preferences and intentions to buy edamame products in the U.S., especially domestic products. Data was collected through a web-based survey distributed through Qualtrics^{XM} and a convenience sampling method was chosen. Volunteers who completed the survey (N = 309) were 82% female, 57% residents of the South Atlantic area, and 79% daily consumers of vegetables. Survey respondents had a positive attitude toward domestically produced vegetables and valued supporting U.S. producers. Overall, domestically grown, in-shell edamame products were preferred compared to shelled edamame or imported products. Regarding future purchasing, respondents exhibited higher intention to buy fresh edamame relative to frozen edamame. Additionally, respondents considered price, availability, and familiarity with the vegetable brand, respectively, as the most important factors in their decision-making process to buy edamame products. Our study confirmed there is a market potential for domestically produced edamame and it also provides valuable information to support future studies, production decisions, and the growth of the edamame agrobusiness in the U.S.

Keywords: Glycine max (L.) Merr., vegetable soybean, specialty crop, domestic production, survey

INTRODUCTION

Edamame is the Japanese name for vegetable soybean (*Glycine max* (L.) Merr.), a nutritious vegetable crop widely consumed in Asian countries, mostly as a snack (Mebrahtu and Devine, 2008; Carneiro et al., 2020). In the past two decades, edamame sales and consumption have been increasing in the U.S. (Zhang and Kyei-Boahen, 2007; Wolfe et al., 2018; Neill and Morgan, 2021), which has aroused the interest of breeders, growers, and food processors to produce this specialty crop in the country (Ogles et al., 2016). In the Mid-Atlantic and Southeast areas of the U.S., for

example, edamame has been suggested as a promising alternative crop to substitute traditional row crops, such as tobacco (Carson et al., 2011; Neill and Morgan, 2021). Additionally, edamame can be an important ally to increase average consumption of fruit and vegetables in the U.S., which remains lower than recommended by the Dietary Guidelines for Americans (Storey and Anderson, 2018). Nevertheless, several challenges still need to be addressed to reduce the increasing need for imports and promote domestic production of edamame in the U.S. For instance, the development of improved seeds and machinery that reduces the exhaustive nature of labor during production and harvest of edamame, improvements in weed management, the absence of processing facilities, and restricted consumer base and firmly established marketing channels are some major challenges that have been identified in the literature (Zhang and Kyei-Boahen, 2007; Zhang et al., 2017). Although the U.S. is one of the largest soybean producers in the world, most domestic soybeans are targeted to animal feed and food ingredients. Seasonal production and short harvest period also hamper the supply of fresh edamame in the country and increase the demand for imports. As a result, most edamame beans and pods sold in the U.S. are in their frozen form and there is very limited availability of fresh edamame for the domestic market (Montri et al., 2006; Nolen et al., 2016; Wolfe et al., 2018).

Only a few studies have gathered information about preferences, motivations, and purchase intentions of edamame consumers in the U.S. market (Carneiro et al., 2020), which results in a lack of recent information regarding which factors may drive edamame consumption and sales in the country. Relevant studies on consumption and purchase intention of edamame were performed in the metropolitan Philadelphia area, PA in the early 2000s (Kelley and Sánchez, 2005; Montri et al., 2006). However, consumer profile and food trends have significantly changed in the last two decades, which motivated our research group to perform this exploratory consumer study. Recent data can help construct a more accurate picture of current and potential edamame consumers and this information can be used, for example, to support the development of a sustainable edamame agrobusiness in the U.S. Understanding current needs and preferences of domestic vegetable consumers, as well as their motivational factors to introduce, include, and sustain edamame in their shopping and diet (retail, food service, and in-home) is vital to prepare key messages to farmers, processors, health specialists, and consumers at all stages of the agriculture and food systems, including the development of new edamame cultivars through plant-breeding efforts and production decisions (Nardi et al., 2019; Carneiro et al., 2020). In this study, we hypothesized consumers in the U.S. have a positive attitude toward domestically produced edamame and investigated consumers' intention to purchase different types of edamame products. Our goal was to identify consumer preferences that could support business decisions, future research, and potentially promote the domestic production and consumption of edamame.

TABLE 1 | Theories, models, and disciplines for food consumer science.

Theory or model	Discipline/knowledge field				
Asymmetry of information	Economics				
Economic household models					
Economy of quality					
Food safety economics					
Institutional economics					
Bio-psychological approach	Food science/nutrition				
Health belief model					
Theory of reasoned action (TRA)	Psychology				
Theory of planned behavior (TPB)					
Food choice	Sociology				
Process model					
Theory of linear knowledge transfer or	Communication				
demand driven					
Food supply chain management	Marketing				
Corporate social responsibility					

Adapted from Barjolle et al. (2013).

MATERIALS AND METHODS

Survey

Several theories and models have been used as framework to guide food consumer studies (Table 1). In this exploratory study, the constructs of the Theory of Planned Behavior (TPB) (Ajzen, 1991), attitudes, subjective norms, and perceived behavior control, were the basis of the questionnaire designed to investigate preferences and intention of consumers in the U.S. to buy and consume edamame products, especially domestically produced products. The TPB states that it is possible to predict the intention one has to perform different behaviors (e.g., food consumption behavior) by considering an individual's attitudes toward behavior (e.g., individual's beliefs about consequences of consuming a specific food product), subjective norms (e.g., beliefs about other people's approval or disapproval to a specific food consumption-social pressure), and perceived behavioral control (e.g., factors that individuals believe would make it easier or harder to consume a specific food). Also, according to Ajzen (1991), a behavior is more likely to be performed when there is a strong intention to perform it (Figure 1).

Our survey contained an initial consent-in survey question (question 0), which was followed by 33 exploratory questions. Survey questions were mostly adapted from Vabø and Hansen (2016) and grouped as follows: current food (vegetable/edamame) consumption behavior (1–2), attitudes (3–15), subjective norms (16–21), perceived behavioral control (22–28), purchase intentions (29), and demographics (30–33). Participants were asked to answer most questions (3–24 and 26–28) using a 6-point Likert scale (1 = "strongly disagree"; 6 = "strongly agree"; no neutral point). Questions 1–2, 30–31, and 33 were closed-ended multiple-choice questions, 25 and 29 were ranking questions, and question 32 was an open-ended question.



Sample

The non-probability convenience sampling method was chosen and participation was based on the volunteer's willingness to take part in the study. Before beginning our investigation, this study obtained ethical approval from the Virginia Tech Institutional Review Board (IRB) for research involving human subjects (IRB 20-023). Then, data collection was open for 7.5 weeks through Qualtrics^{XM} (Qualtrics, Provo, UT), a webbased survey platform. Recruitment of participants occurred through direct posts in the Virginia Tech Daily News and social media, listservs, and direct emails that contained the survey link or QR code; no compensation was provided. A total of 415 volunteers (≥18 years old) gave informed consent before taking part on this study, which occurred online by answering "I agree to participate" in the initial consent-in survey question. However, only 314 participants (75.7%) filled out the whole survey. Although the consent question stated the survey was directed to adults living in the U.S. at the time the survey was taken, 5 volunteers answered on question 32 ("In which state of the United States do you currently live?") they were not living in the U.S. and their results were not considered for statistical analysis. Therefore, a total of 309 complete surveys answered by U.S. residents were considered for statistical analysis.

Data Analysis

The frequencies of participants for demographic questions and behavioral questions were calculated and chi-square test of independence was performed to investigate relationship between two categorical variables (for example, vegetable or edamame consumption and gender). Cronbach's alpha was used to evaluate internal consistency of the TPB questions (attitude, subjective norms, perceived behavioral control). Spearman's rank-order correlation tests were performed to determine the relationship between consumers' choices in questions 25 and 29. A 5% significance level ($\alpha = 0.05$) was considered for statistical analysis, which was performed using JMP[®] Pro 15.0.0.

RESULTS AND DISCUSSION

Consumer's Self-Identity and Vegetable/Edamame Consumption

The demographic profile (self-identity) of the participants who completed the questionnaire and answered they were living in the U.S. at the time the survey was taken (n = 309) is shown in Table 2. Most volunteers were self-identified as female (82%), between 21 and 29 years old (36%), residents of the South Atlantic area (57%), and their household income was <\$100,000 (64%; <\$50,000 = 32%). On average, our participants were more likely to consume vegetables one or more times per day (79%) and consume edamame a few times per year (52%) as part of their diet. A very similar consumption behavior was reported by the participants of our sensory studies performed over 2 consecutive years in Blacksburg, VA (Carneiro et al., 2021); considering the average of both years, our sensory participants, who were mostly female (55%), reported their intentional vegetable consumption was at least once a day (69%) and consumption of edamame was a few times per year (49%). Even though the demand for edamame in the U.S. has been increasing 12-15% annually (Neill and Morgan, 2021), our studies confirmed the frequency in which consumers include edamame in their diets is still low and it suggests the edamame market has potential to continue growing in the country.

The relationship (dependence) between edamame consumption or vegetable consumption, and gender identity, age range, total household income, or U.S. region were tested. Chi-square test only suggested a positive relationship between edamame consumption and gender identity (p < 0.05), as well as between vegetable consumption and gender identity (p < 0.05). However, our dataset was skewed toward female respondents, which was likely due to the limitations of the convenience sampling method chosen for this study. Previous consumer studies on fruit and vegetable consumption (Emanuel et al., 2012) and on edamame (Kelley and Sánchez, 2005; Montri et al., 2006) that were conducted in the U.S. also showed female volunteers were more likely to participate in the studies. Nevertheless, we suggest that the relationships between gender identity and vegetable or edamame consumption that were reported above should be reviewed with a more balanced dataset. Cultural factors are also recognized as dominant factors in food choice (Steptoe et al., 1995; Pocol et al., 2021) and a previous consumer study on edamame considered reported ethnicity for data analysis, due to the fact edamame is traditionally consumed in Asian countries (Kelley and Sánchez, 2005). In this study, ethnic/racial background of participants was not investigated and it is noted as a potential limitation of the work. Additionally, it is known that consumers consider other food-related associations beyond exclusively satisfying their nutritional needs; lifestyle, healthiness, convenience, and sensory appeal are just some examples of other factors that can be considered when making dietary choices (Barjolle et al., 2013). Our study did not identify psychological or individual traits in consumers, such as lifestyle and healthiness. Thus, we suggest that further studies investigate whether consumers identify themselves as vegetarians or vegans, have concerns regarding their health, or follow a particular

TABLE 2 | Demographic profile of participants.

Characteristic	Answer	Participants*			
		%	Coun		
Current gender identity	Male	14.6	45		
	Female	81.6	252		
	Transgender male/trans man/female-to-male (FTM)	0.0	0		
	Transgender female/trans woman/male-to-female (MTF)	0.0	0		
	Genderqueer, neither exclusively male nor female	1.3	4		
	Additional gender category (or other)	1.0	3		
	Prefer not to answer	1.6	5		
Age range	Under 20 years old	2.9	9		
	21–29 years old	36.2	112		
	30–39 years old	26.5	82		
	40–49 years old	12.3	38		
	50–59 years old	12.3	38		
	60 years or older	8.1	25		
	Prefer not to answer	1.6	5		
Geographic region	New England	3.2	10		
	Middle Atlantic	6.5	20		
	East North Central	9.1	28		
	West North Central	3.2	10		
	South Atlantic	57.0	176		
	East South Central	1.0	3		
	West South Central	3.2	10		
	Mountain	6.1	19		
	Pacific	10.4	32		
	Other - Military Okinawa	0.3	1		
Total household income	<\$50,000	32.4	100		
	\$50,000–99,999	31.7	98		
	\$100,000-149,999	14.9	46		
	\$150,000 or more	10.7	33		
	Prefer not to answer	10.4	32		

*Only completed surveys answered by consumers living in the U.S. at the time the survey was taken were considered (n = 309).

diet. Another limitation that we identified is self-reporting bias. Even though the reliance on self-reported behavior measures is common in this type of consumer studies, it can be seen as a limitation (Carfora et al., 2015).

TPB Constructs: Attitude, Subjective Norms, and Perceived Behavioral Control

Descriptive statistics (means and standard deviations) for TPB constructs (attitude, subjective norms, and perceived behavioral control) are shown in **Table 3**. Cronbach's alpha scores showed "questionable" internal consistency for attitudes (0.68), "acceptable" internal consistency for subjective norms (0.79), and "poor" internal consistency for perceived behavioral control (0.58) (Gliem and Gliem, 2003). Results shown in **Table 3** suggest consumers in the U.S. have a positive impression of domestic vegetables (produced in the U.S.) (mean = 4.8 ± 1.1 ; Likert scale: 4 = "Somewhat agree" and 5 = "Agree"), as hypothesized. Our survey respondents also had a positive impression of the vegetable seller when choosing edamame (mean = $4.3 \pm$

0.9). Regarding their attitude toward edamame products, they strongly agreed that it is important to them that edamame is safe for consumption, which means the product does not offer risk of food poisoning or foodborne illness (mean = 5.7 \pm 0.6; Likert scale: 6 = "Strongly agree"). A somewhat neutral opinion was observed when participants were asked whether domestically produced edamame is safer for consumption than imported edamame (mean = 3.5 ± 1.2 ; Likert scale: 3 ="Somewhat disagree" and 4 = "Somewhat agree"). Nevertheless, participants showed highest agreement with the subjective norms that by choosing domestically produced edamame they support domestic producers (mean = 5.1 ± 0.9) and supporting domestic edamame producers is important to them (mean = 4.3 ± 1.1). These results are of great importance because they suggest consumer acceptability of domestic edamame in the U.S. market and justify breeding efforts to develop improved seeds to be grown in the country. However, it is relevant to remember that other factors can also drive edamame acceptability in the U.S., such as sensory characteristics (Carneiro et al., 2021). Recently, TABLE 3 | Mean likeness and standard deviation of theory of panned behavior (TPB) variables.

TPB variable		Question	Mean*	Standard deviation
Attitudes	3	I have a positive impression of the vegetable seller when choosing edamame (vegetable soybean).	4.3	0.9
	4	I have a positive impression of certified organic vegetables (vegetables produced following USDA organic standards, without genetic modification, ionizing radiation, synthetic herbicides, pesticides, or fertilizers).	4.2	1.3
	5	I have a positive impression of non-GMO vegetables (vegetables without any genetic modification/bioengineering).	3.9	1.5
	6	I have a positive impression of domestic vegetables (vegetables produced in the United States).	4.8	1.1
	7	A positive impression of the vegetable seller is important to me when choosing edamame (vegetable soybean).	4.0	1.2
	8	I have a negative impression of foreign (imported) vegetables in relation to GMO and non-GMO vegetables.	3.0	1.2
	9	It is important to me that edamame (vegetable soybean) is safe for consumption (does not offer risk of food poisoning or foodborne illness).	5.7	0.6
	10	Domestically produced edamame (vegetable soybean) is safer for consumption than imported edamame.	3.5	1.2
	11	A consistent sensory quality (e.g., appearance, flavor, taste, and texture) is important to me to continue to buy edamame (vegetable soybean).	4.9	0.9
	12	Domestically produced edamame (vegetable soybean) has a more consistent sensory quality (e.g., appearance, flavor, taste, and texture) than imported alternatives.	3.3	1.0
	13	I have a negative impression of frozen edamame (vegetable soybeans).	2.3	1.3
	14	Frozen domestically produced edamame (vegetable soybean) is fresher than frozen imported edamame.	3.2	1.2
	15	Edamame (vegetable soybean) beans sold encased in their pods are better than shelled edamame beans.	4.0	1.4
Subjective norms	16	By choosing domestically produced edamame (vegetable soybean) we support domestic producers.	5.1	0.9
	17	People important to me are concerned with upholding domestic food traditions.	3.9	1.4
	18	My family and friends think we should all buy domestic products when possible.	3.9	1.3
	19	Supporting domestic edamame (vegetable soybean) producers is important to me.	4.3	1.1
	20	When buying edamame (vegetable soybean), I take into consideration the support of domestic food traditions.	3.4	1.3
	21	My choice of buying domestically produced edamame (vegetable soybean) will be influenced by the opinions of my family and friends.	2.9	1.3
Perceived behavioral control	22	There is wide range of domestically produced edamame (vegetable soybean) available in the places where I do my grocery shopping.	2.7	1.2
	23	I think that frozen edamame (vegetable soybean) is reasonably priced (in pod = $1.69/10$ oz package and shelled = $1.69/8$ oz package).	4.6	0.9
	24	Domestic edamame (vegetable soybean) is available at the grocery store where I most frequently purchase vegetables.	3.6	1.5
	26	I would pay more for domestically produced edamame (vegetable soybean) relative to non-domestically produced edamame.	3.7	1.2
	27	I would pay more for certified organic edamame (vegetable soybean) relative to non-certified organic edamame.	3.3	1.5
	28	I would pay more for certified non-GMO edamame (vegetable soybean) relative to genetically modified edamame.	3.0	1.5

*6-point Likert scale (1 = "strongly disagree"; 3 = "slightly disagree"; 4 = "slightly agree"; 6 = "strongly agree"; no neutral point). Only completed surveys answered by consumers living in the U.S. at the time the survey was taken were considered (n = 309).

Flores et al. (2019) reported that higher scores in overall liking, texture and appearance of different edamame cultivars increased the odds of consumers answering "yes" in their question about purchase intention. In this study, respondents agreed that a consistent sensory quality (e.g., appearance, flavor, taste, and texture) is important to them to continue to buy edamame (mean

= 4.9 ± 0.9), but slightly disagreed that domestically produced edamame has a more consistent sensory quality than imported alternatives (mean = 3.3 ± 1.0). These results reinforce the importance of applying sensory evaluation methods to guide edamame development, which was discussed in previous review article (Carneiro et al., 2020) and is currently being done by

TABLE 4 | Important factors and product characteristics considered by consumers during decision process to buy edamame.

Factor or product characteristic	Importance in purchase decision process-rank*									Factor rank
	1		2		3		4			
	%	Count	%	Count	%	Count	%	Count		
Price	39.1	106	30.6	83	14.4	39	15.9	43	271	1
Availability	38.3	95	27.8	69	19.8	49	14.1	35	248	2
Familiarity with the vegetable brand	7.6	11	20.7	30	38.6	56	33.1	48	145	3
Frozen edamame in the pods	16.2	19	21.4	25	29.9	35	32.5	38	117	4
Domestically produced (not imported)	11.6	13	22.3	25	21.4	24	44.6	50	112	5
Fresh (not frozen) edamame pods	21.8	22	29.7	30	26.7	27	21.8	22	101	6
Certified organic	18.5	17	16.3	15	34.8	32	30.4	28	92	7
Frozen shelled edamame beans (not in pods)	13.3	8	20.0	12	36.7	22	30.0	18	60	8
Non-GMO	21.4	12	28.6	16	25.0	14	25.0	14	56	9
Fresh (not frozen) shelled edamame beans	15.6	5	12.5	4	34.4	11	37.5	12	32	10
Imported only	50.0	1	0.0	0	0.0	0	50.0	1	2	11

*1 = The most important factor or product characteristic. Only completed surveys answered by consumers living in the U.S. at the time the survey was taken were considered (n = 309).

breeding programs in Arkansas and Virginia (Carneiro et al., 2021).

In addition to the positive impression of domestic vegetables, participants expressed a positive impression of certified organic vegetables produced following USDA organic standards (mean = 4.2 \pm 1.3), and a slightly positive impression of non-GMO vegetables, which are vegetables without any genetic modification/ bioengineering (mean = 3.9 ± 1.5). Although the statement was about vegetables in general, not only edamame, a stronger positive attitude was also expected by the researchers toward non-GMO. It is important to consider one limitation of our study that may have impacted the answer to this question was the use of a 6-point Likert scale, which did not offer a neutral choice to the respondents and forced them to choose between "somewhat disagree" (3) and "somewhat agree" (4). Additionally, our respondents slightly agreed they would pay more for domestically produced edamame (mean = 3.7 ± 1.2), but somewhat disagreed they would pay more for certified organic edamame (mean = 3.3 ± 1.5) or certified non-GMO edamame (mean = 3.0 ± 1.5). This result differs from a recent economics study conducted in Arkansas that reported significantly higher willingness to pay for edamame labeled as non-genetically modified (Wolfe et al., 2018). Therefore, further applied economics studies are suggested to investigate consumer willingness-to-pay for the different edamame products described above (domestic vs. imported, certified organic vs. non-certified organic, GMO vs. non-GMO).

Although our survey respondents somewhat agreed that domestic edamame is available at the grocery store where they most frequently purchase vegetables (mean = 3.6 ± 1.5), they somewhat disagreed that there is a wide range of domestically produced edamame available in the places where they do their grocery shopping (mean = 2.7 ± 1.2 ; Likert scale: 2 = "Disagree"). This perception is in accordance with the fact the U.S. market is mostly supplied by imports and the domestic production is still low (Neill and Morgan, 2021). Although a

negative impression of frozen edamame was not confirmed, our survey respondents agreed that edamame beans sold encased in their pods are better than shelled edamame beans (mean = 4.0 ± 1.4). Moreover, respondents tended to agree that frozen edamame is reasonably priced (in pod = \$1.69/10 oz package and shelled = \$1.69/8 oz package) (mean = 4.6 ± 0.9). Thus, the prices above can serve as references for future economic studies and for growers and producers who aim to sell their edamame products directly to consumers.

Edamame Purchase Intent

Edamame is a vegetable with high nutritional value and a vegetarian/vegan-friendly source of protein (Carneiro et al., 2020). In fact, Kelley and Sánchez (2005) reported that most participants of their consumer studies expressed a positive likelihood to purchase edamame after they were informed about its health benefits. According to Nardi et al. (2019), consumers have a stronger tendency to turn their intention into consumption when the food choice regards healthy or hedonic products. Our participants ranked the four most important factors and product characteristics in their decision-making process to buy edamame and results are shown in Table 4. Price was the most important factor for the participants, and it was followed by availability and familiarity with the vegetable brand. Price was also identified by Montri et al. (2006) as one of the main factors that affect edamame consumers' decision to buy a new produce from supermarkets in the early 2000s; it had similar average score to "sample of the produce at supermarket," but it was rated below "friend's recommendation." Drugău-Constantin (2019) also reported "recommendation from a friend/family/known acquaintance" as the major factor that influences U.S. consumers' purchase decision. Although "friend's recommendation" was not a factor that we directly investigated in our study, our participants showed disagreement (mean = 2.9 \pm 1.3; Likert scale: 2 = "Disagree" and 3 = "Somewhat disagree") with the statement "my choice of buying domestically TABLE 5 | Correlation between edamame purchase factors or product characteristics ranked by consumers in the U.S.

			Prob> ρ ^ε
F1 = Price	125	-0.0545	0.5464
F1 = Price	219	-0.3456	<0.0001
F2 = Familiarity with the vegetable brand	119	-0.2218	0.0153
F1 = Price	70	-0.3951	0.0007
F2 = Familiarity with the vegetable brand	31	-0.3148	0.0846
F3 = Availability	62	-0.2963	0.0193
F1 = Price	42	-0.5763	<0.0001
F2 = Familiarity with the vegetable brand	18	-0.2047	0.4151
F3 = Availability	29	-0.4822	0.0081
F4 = Certified organic	31	0.1209	0.5172
F1 = Price	91	-0.3099	0.0028
F2 = Familiarity with the vegetable brand	28	-0.5038	0.0063
F3 = Availability	68	-0.4600	<0.0001
F4 = Certified organic	21	-0.4488	0.0413
F5 = Non-GMO	13	-0.0840	0.7850
F1 = Price	28	-0.4919	0.0078
F2 = Familiarity with the vegetable brand	4	0.5774	0.4226
F3 = Availability	20	-0.1953	0.4092
F4 = Certified organic	5	-0.2294	0.7105
F5 = Non-GMO	4	-0.5000	0.5000
F6 = Fresh (not frozen) edamame pods	14	0.3457	0.2260
F1 = Price	97	-0.4236	<0.0001
F2 = Familiarity with the vegetable brand	47	-0.5049	0.0003
	100	-0.3497	0.0004
			0.0742
0			0.4744
			0.8414
			-
			0.0224
			0.1165
			0.0119
			0.2996
-			0.1934
			0.1835
			0.1633
			0.7168
			< 0.0001
			0.1155
			< 0.0001
-			0.0695
			0.1314
			0.3832
			0.8454
			0.9448
F9 = Frozen shelled edamame beans (not in pods)	13	-0.2842	0.3467
F1 = Price	1	-	-
F2 = Familiarity with the vegetable brand	1		-
F3 = Availability	2	-1.0000	-
F4 = Certified organic	0	-	-
0	0	-	-
	-	-	-
		-	-
		-1 0000	-
		-	-
F10 = Domestically produced (not imported)	0		-
	F1 = PriceF2 = Familiarity with the vegetable brandF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF4 = Certified organicF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF4 = Certified organicF5 = Non-GMOF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF4 = Certified organicF5 = Non-GMOF6 = Fresh (not frozen) edamame podsF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF4 = Certified organicF5 = Non-GMOF6 = Fresh (not frozen) edamame podsF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF4 = Certified organicF5 = Non-GMOF6 = Fresh (not frozen) shelled edamame beansF1 = PriceF2 = Familiarity with the vegetable brandF3 = AvailabilityF4 = Certified organicF5 = Non-GMOF6 = Fresh (not frozen) shelled edamame beansF8 = Frozen edamame in the podsF7 = Fresh (not frozen) shelled mamme podsF7 = Fresh (not frozen) edamame podsF7 = Fresh (not frozen) edamame podsF7 = Fresh (not frozen) shelled edamame beansF8 = Frozen edamame in the podsF9 = Frozen shelled edamame beansF8 = Frozen edamame in the podsF9 = Fresh (not frozen) edamame pods	F1 = Price219F2 = Familiarity with the vegetable brand119F1 = Price70F2 = Familiarity with the vegetable brand31F3 = Availability62F1 = Price42F2 = Familiarity with the vegetable brand18F3 = Availability29F4 = Certified organic31F1 = Price91F2 = Familiarity with the vegetable brand28F3 = Availability68F4 = Certified organic21F5 = Non-GMO13F1 = Price28F2 = Familiarity with the vegetable brand4F3 = Availability20F4 = Certified organic5F5 = Non-GMO13F1 = Price28F2 = Familiarity with the vegetable brand47F3 = Availability20F4 = Certified organic5F5 = Non-GMO4F6 = Fresh (not frozen) edamame pods14F1 = Price97F2 = Familiarity with the vegetable brand47F3 = Availability100F4 = Certified organic21F5 = Non-GMO7F6 = Fresh (not frozen) edamame pods30F7 = Fresh (not frozen) edamame pods14F1 = Price50F2 = Familiarity with the vegetable brand24F3 = Availability51F4 = Certified organic10F5 = Non-GMO6F6 = Fresh (not frozen) shelled edamame beans8F8 = Frozen edamame in the pods14 <td< td=""><td>F1 = Price 219 -0.3456 F2 = Familiarity with the vegetable brand 119 -0.2218 F1 = Price 70 -0.3851 F2 = Familiarity with the vegetable brand 31 -0.3148 F3 = Availability 62 -0.2963 F1 = Price 42 -0.5763 F2 = Familiarity with the vegetable brand 18 -0.2047 F3 = Availability 29 -0.4822 F4 = Certified organic 11 -0.2099 F1 = Price 91 -0.3038 F3 = Availability 68 -0.4000 F4 = Certified organic 21 -0.4488 F5 = Non-GMO 13 -0.0840 F1 = Price 28 -0.4919 F2 = Familiarity with the vegetable brand 4 0.5774 F3 = Availability 20 -0.1953 F4 = Certified organic 5 -0.2284 F5 = Non-GMO 4 0.3457 F1 = Price 97 -0.4236 F2 = Familiarity with the vegetable brand 47 -0.5049 F3 = Availability 100 -0.3427</td></td<>	F1 = Price 219 -0.3456 F2 = Familiarity with the vegetable brand 119 -0.2218 F1 = Price 70 -0.3851 F2 = Familiarity with the vegetable brand 31 -0.3148 F3 = Availability 62 -0.2963 F1 = Price 42 -0.5763 F2 = Familiarity with the vegetable brand 18 -0.2047 F3 = Availability 29 -0.4822 F4 = Certified organic 11 -0.2099 F1 = Price 91 -0.3038 F3 = Availability 68 -0.4000 F4 = Certified organic 21 -0.4488 F5 = Non-GMO 13 -0.0840 F1 = Price 28 -0.4919 F2 = Familiarity with the vegetable brand 4 0.5774 F3 = Availability 20 -0.1953 F4 = Certified organic 5 -0.2284 F5 = Non-GMO 4 0.3457 F1 = Price 97 -0.4236 F2 = Familiarity with the vegetable brand 47 -0.5049 F3 = Availability 100 -0.3427

^aSignificant correlation is indicated by numbers in bold.

TABLE 6 | Rank of edamame products most likely to be purchased by consumers in the U.S.

Edamame product			Total count	Product rank						
	1		2		3		4			
	%	Count	%	Count	%	Count	%	Count		
Fresh (not frozen) edamame pods	39.9	91	22.4	51	20.2	46	17.5	40	228	1
Frozen edamame in the pods	37.6	76	26.7	54	19.3	39	16.3	33	202	2
Domestically produced (not imported)	14.1	28	24.2	48	37.4	74	24.2	48	198	3
Certified organic	24.9	43	17.3	30	30.6	53	27.2	47	173	4
Fresh (not frozen) shelled edamame beans	11.6	19	29.3	48	28.0	46	31.1	51	164	5
Frozen shelled edamame beans (not in pods)	25.2	37	27.9	41	20.4	30	26.5	39	147	6
Non-GMO	13.1	14	33.6	36	16.8	18	36.4	39	107	7
Imported only	5.9	1	5.9	1	17.6	3	70.6	12	17	8

*1 = The most likely to buy product. Only completed surveys answered by consumers living in the U.S. at the time the survey was taken were considered (n = 309).

produced edamame (vegetable soybean) will be influenced by the opinions of my family and friends" (Table 3). Edamame in the pods was the most important product characteristic and frozen edamame products were ranked higher than similar fresh ones. Even though consumers may believe fresh fruits and vegetables are healthier or tastier, convenience is an important advantage of the frozen fruits/vegetable products that can affect consumer purchase decision (Storey and Anderson, 2018) and was possibly valued by our respondents. Convenience can be linked, for example, to easier selection, purchase, food preparation (e.g., prewashed), cooking, as well as cleaning before and/or after cooking (Storey and Anderson, 2018), and these components could be further investigated in future research. Moreover, among the 11 factors presented to rank, "domestically produced (not imported)" was ranked as the fifth most important factor, while "imported only" was ranked as the least important factor, which is consistent with the results presented in Table 3 and confirms a preference for domestic products (produced in the U.S.). A significant negative correlation was observed between 18 pairs of factors (Table 5), which means that when the rank of one factor increased, the rank of the other factor decreased. For instance, the rank of price was negatively correlated with the rank of all other factors and product characteristics (p < 0.05), except for "familiarity with the vegetable brand" (p > 0.05) and "imported only" (insufficient pairs).

Next, our participants ranked the four edamame products they were most likely to buy on the day the survey was taken. Overall, shelled edamame products ranked lower than edamame in the pods (**Tables 4**, **6**). The four products chosen by most consumers were: (1) fresh (not frozen) edamame in the pods, (2) frozen edamame in the pods, (3) domestically produced (not imported), and (4) certified organic (**Table 6**). Even though consumers perceived a low availability of domestically produced edamame where they do their grocery shopping (**Table 3**, question 22), "imported only" was the least chosen purchase option, which reinforces previous suggestion that domestic edamame products (not imported) are valued by consumers in the U.S. (**Table 6**). Furthermore, our purchase intention results are aligned with the consumer study performed by Montri et al. (2006) in the metropolitan Philadelphia area. Authors reported that consumers would prefer to buy fresh edamame in-shell (in the pods) only (48.5%) or both shelled and in the pods (48.5%), instead of shelled (beans) only (3%). Also, most participants in their study reported they were more likely to buy edamame because it was produced in Pennsylvania. Shelled beans may not be the consumer most preferred option for edamame products, but they may be valuable for food service menus (e.g., salad bars). Consumer attitude toward food service retail selection options preferences was not investigated in our survey and future study can help identify alternative routes of sales for the different edamame products. As shown in Table 3, our participants slightly agreed that they would pay more for domestically produced edamame relative to nondomestically produced edamame (mean = 3.7 ± 1.2 ; Likert scale: 3 = "Somewhat disagree" and 4 = "Somewhat agree"). Thus, future studies are important to quantify how much consumers are willing to pay for different types of domestic edamame. For instance, Wolfe et al. (2018) reported consumers in the U.S. are willing to pay more (at least \$0.42 more) for non-GMO labeled edamame in comparison with unlabeled or GMO labeled edamame. However, in our study, non-GMO edamame was ranked as the seventh edamame product most likely to be purchased by our participants from our list of 8 products (Table 6) and ranked nineth from our list of 11 factors considered during the purchase decision process. It suggests that when analyzed within a broader set of factors (not directly related), consumers may value other factors, such as convenience, over production characteristics, such as non-GMO, for example. A significant negative correlation was observed between 17 pairs of edamame products (Table 7). The rank of domestically produced (not imported) edamame was negatively correlated with the rank of all other factors and product characteristics (p < 0.05), except for "frozen shelled edamame beans (not in pods)" and "imported only" (p > 0.05). However, as "important only" was not chosen by many respondents, the low number of pairs possibly affected statistical analysis.

TABLE 7 | Correlation between edamame products ranked by consumers in the U.S.

Variable	By variable	Count (Pairs)	Spearman ρ	Prob> ρ ^a
P2 = Non-GMO	P1 = Certified organic	87	0.1837	0.0885
P3 = Fresh (not frozen) edamame pods	P1 = Certified organic	107	-0.4170	<0.0001
	P2 = Non-GMO	57	-0.3976	0.0022
P4 = Fresh (not frozen) shelled edamame beans	P1 = Certified organic	66	-0.5466	<0.0001
	P2 = Non-GMO	31	-0.4277	0.0164
	P3 = Fresh (not frozen) edamame pods	125	-0.0026	0.9770
P5 = Frozen edamame in the pods	P1 = Certified organic	90	-0.4184	<0.0001
	P2 = Non-GMO	51	-0.5164	0.0001
	P3 = Fresh (not frozen) edamame pods	153	-0.3423	<0.0001
	P4 = Fresh (not frozen) shelled edamame beans	86	-0.5249	<0.0001
P6 = Frozen shelled edamame beans (not in pods)	P1 = Certified organic	51	-0.2673	0.0579
	P2 = Non-GMO	28	-0.6971	<0.0001
	P3 = Fresh (not frozen) edamame pods	98	-0.6228	<0.0001
	P4 = Fresh (not frozen) shelled edamame beans	97	-0.2245	0.0270
	P5 = Frozen edamame in the pods	96	-0.1176	0.2539
P7 = Domestically produced (not imported)	P1 = Certified organic	113	-0.3013	0.0012
	P2 = Non-GMO	66	-0.4608	<0.0001
	P3 = Fresh (not frozen) edamame pods	133	-0.3311	<0.0001
	P4 = Fresh (not frozen) shelled edamame beans	84	-0.3447	0.0013
	P5 = Frozen edamame in the pods	117	-0.2113	0.0222
	P6 = Frozen shelled edamame beans (not in pods)	67	-0.1879	0.1278
P8 = Imported only	P1 = Certified organic	5	-0.5526	0.3340
	P2 = Non-GMO	1	-	-
	P3 = Fresh (not frozen) edamame pods	11	-	-
	P4 = Fresh (not frozen) shelled edamame beans	3	-1.0000	<0.0001
	P5 = Frozen edamame in the pods	13	0.0000	1.0000
	P6 = Frozen shelled edamame beans (not in pods)	4	-0.5000	0.5000
	P7 = Domestically produced (not imported)	14	0.1788	0.5407

^aSignificant correlation is indicated by numbers in bold.

CONCLUSION

Our study suggested there is a positive attitude toward domestically produced edamame in the U.S. market, as hypothesized, and identified a higher purchase intention for domestic edamame products. A higher preference and purchase intention were also identified for in-shell edamame products. Edamame is a specialty crop not yet largely produced in the U.S. and our findings provide valuable insights to support future studies that can help promote a sustainable growth of the edamame agrobusiness in the country. As price was identified as the major factor in the consumer decisionmaking process to buy edamame in the U.S., future economic studies that investigate willingness-to-pay for a diverse set of domestic edamame products (e.g., frozen vs. fresh, in-shell vs. shelled, certified organic vs. non-certified organic, non-GMO vs. GMO) can help local growers and processors develop their business strategies. Likewise, the market potential for organic production of edamame needs to be further investigated. The fact that consumers value a consistent sensory quality of edamame products reinforces the need for developing improved cultivars and standardizing production practices with the support of sensory data. Additionally, exploration of other value-added processed products with edamame as a major ingredient could possibly expand the interest in and motivation for edamame and further investigation is recommended. As a positive relationship between edamame consumption and gender identity was suggested, it would be valuable to further explore the impact of self-identity (e.g., self-reported gender, age, or ethnic/racial background) in the TPB variables as well as in the future consumption of edamame products in the U.S. (food choice behavior). Moreover, as a possible alternative to enrich the TPB model and complement our findings, complementary constructs such as risk perception, trust, and past behaviors could also be further explored in the context of investigating consumption of domestic edamame.

DATA AVAILABILITY STATEMENT

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation.

ETHICS STATEMENT

The studies involving human participants were reviewed approved by Virginia Tech Institutional Review and Board (IRB) for research involving human subjects (IRB 20-023). The patients/participants provided informed participate their written consent to in this study.

AUTHOR CONTRIBUTIONS

RC, TD, CN, and SD contributed with conception of the study and questionnaire design. RC collected and analyzed consumer

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