

Original Research

Risk Perceptions and Management Strategies of Rice Smallholders in the Mekong Delta, Vietnam

Huy Duc Dang^{1*}, Thuyen Thi Pham²

¹Department of Business Administration, Economics Faculty, Nong Lam University, HCMC, Vietnam

²Department of Economics, Economics Faculty, Nong Lam University, HCMC, Vietnam

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Abstract

This empirical study investigates Vietnam rice farmers' risk perceptions, risk management strategies, and the relationship with socio-demographic antecedents. Data were randomly collected from 194 farmers in An Giang province - the rice bowl of the Mekong Delta region. A flexible combination of exploratory factor analysis and principal component analysis was used to elucidate farmers' opinions towards risks and their corresponding management strategies. For risk perceptions, low and unstable selling price, unstable input supply, high and fluctuating input price, lack of health protection in pesticide use, and poor quality pesticides were perceived as the top five most important sources of risk in the studied area. For management strategies, make use of the combined harvester, adoption of certified varieties, selecting prestigious partners, increase the percentage of mechanization, matching production schedule with neighbors, and using climate-adaptive varieties were the most pivotal strategies to mitigate risks. The regression results showed that some idiosyncratic strategies can be driven by multiple perceptions, either negative or positive. The study provides empirical evidence to suggest tailored agricultural policies to reinforce farmers' resilience against risks at different levels.

Keywords: agriculture, rice farming, risk perception; risk management, sources of risk

Introduction

Farmers' perceptions and their responses to risks have been proven to be unarguably vital for the understanding of risk behaviors [1-5]. As such, risk perceptions and management strategies have been studied extensively and serve as valuable inputs for different stakeholders and policymakers. However,

perceived risk patterns are highly contextual and not the same across systems and geographical regions [4-6], let alone the incongruity of the perceived levels [7, 8]. Through literature reviews, it has come to our attention that very limited studies have investigated risk perceptions and management strategies of rice – an important cash crop in developing countries, especially in South East Asia regions home to the World second and third largest rice exporters in 2019 – Thailand and Vietnam. As the World's third-largest rice exporter, understanding perceptions about

*e-mail: simon.hdang@gmail.com

risks and management strategies in rice farming will not only boost agricultural sustainability but also provide benefits to a more sustainable livelihood for rice producers, particularly small-scale farmers. For that reason, this paper sets out to provide empirical insights into (1) Vietnamese rice farmers' perceptions of risk and risk management strategies; (2) the relationship between farm and farmers' sociodemographic characteristics and farmers' perceptions of risk and risk management strategies in rice farming. Results from this study are expected to disseminate useful information for farmers and policymakers in designing sustainable development strategies in this non-stop changing farming environments. The paper is unique in a way that it offers insights into risk perception and management strategies of rice farmers in Vietnam which is scarce to date in the current body of literature.

The study is organized in the following orders. First, we elaborate on the conceptual framework in use in section 2. Section 3 describes studied methods and data, while section 4 presents the results and discussion derived from the descriptive and regression analyses. The final section concludes the results of the study and mentions the limitations.

Conceptual Framework

The concept of subjective risk perception has been proposed by Sjöberg, et al. [9] rooted in the psychometric paradigm as complementary to describe individual behaviors where the expected utility theory fails to address [1]. Ever since, empirical studies have been successfully provided evidence to conclude that risk perceptions play a critical role on decision-making behaviors [2, 4-6, 8, 10]. Thus, understanding risk perception and its antecedents are considered pivotal in untangling individuals' decision-making processes.

First, the present study employed the model of decision-making environment of van Raaij [11] as the theoretical foundation as it has been successfully used in analyzing risks in various industries such as dairy farming [1], and fish-farming [4, 5], shrimp farming [8],

and livestock farming [2, 6]. Second, we incorporated the multidimensional risk assessment framework of Crane, et al. [12] which categorizes risks into five specific categories namely production, marketing, financial, legal, and human risks, and was also applied in recent empirical risk-related studies [4, 10].

Fig. 1 illustrates the modified model used in this research. The model indicates the relationship between farm and farmers' characteristics and risk perceptions in agriculture, and then the influence of risk perceptions on economic behavior (or subsequent management strategies). The framework also reveals a spectrum of potential management strategies to confront related risks.

Methods and Data

Sample and Data

Data are collected in July 2019 in An Giang province, known as "the rice bowl" of the Mekong Delta (Fig. 2). Rice farming in the region is commonly practiced in the form of three main crop seasons: the winter-spring, the summer-fall, and the fall-winter season. The stratified sampling method is employed to recruit farmers from the list of potential rice farming households provided by the local agricultural extension office. In An Giang province, Thoai Son and Chau Thanh are identified as the main rice-producing districts with the characteristics that satisfy our data frame. Prior to conducting the survey, a draft questionnaire is sent to one extension agent, and three randomly selected farmers to test its clarity and relevance. After that, a team of two extension agents (commune level) and 10 enumerators helps to facilitate the data collection process. The study encounters difficulty in locating the right farmers on the acquired list due to the lack of properly written address and erroneous GPS locating services. Fortunately, local farmers are so friendly and helpful in referring their colleagues in the surrounding areas, which contributes to the inadvertent usage of

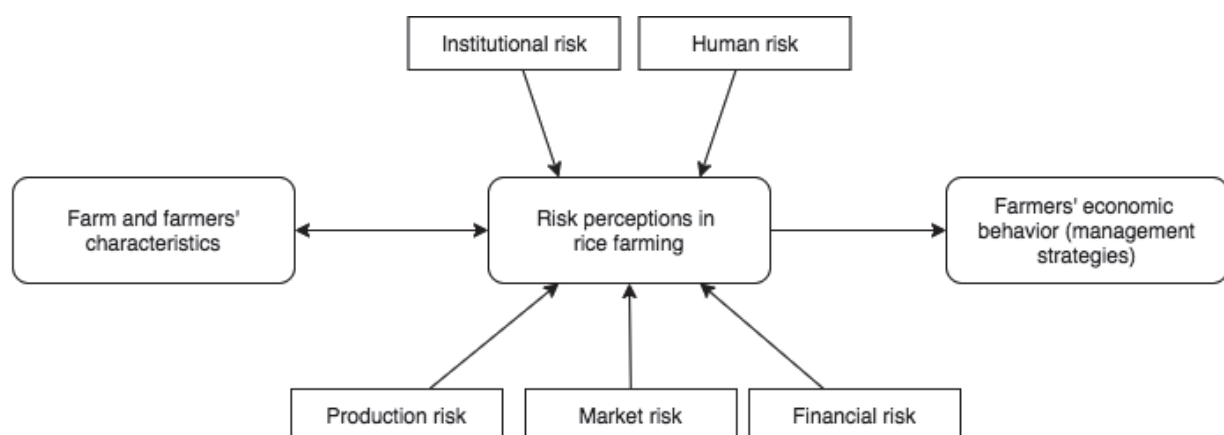


Fig. 1. The studied framework modified from van Raaij [11].

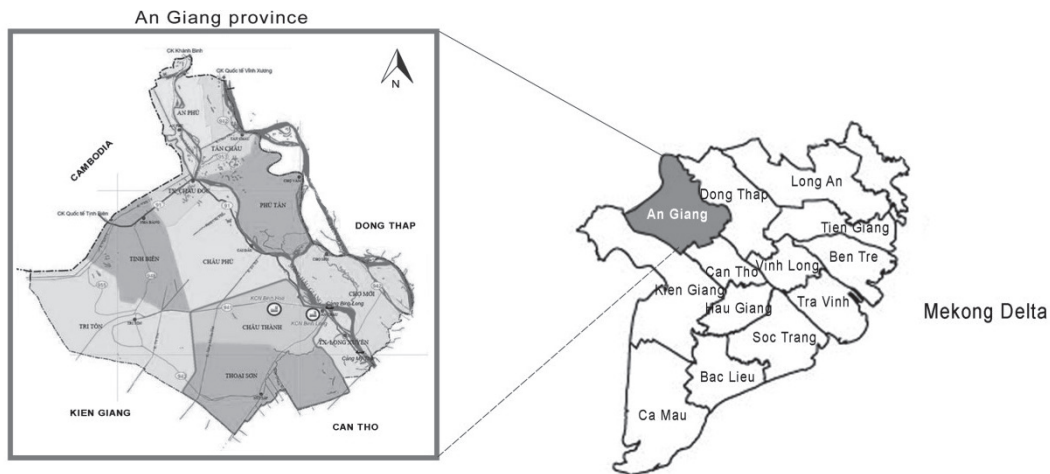


Fig. 2. The study area. Source: author’s elaboration.

the snowball method, complementary to the main data collecting method. Because of that, we finally manage to collect a total of 194 observations. Raw data are preprocessed at the end of the day to avoid missing valuable information.

Econometric Models

The study employed descriptive methods, factor analysis method, and multiple linear regression models. First, the descriptive statistics were useful in classifying the importance of distinct risk perceptions and management strategies by the magnitude of their means. Next, factor analysis and regression models were applied to explore the relationship between risk perceptions and management and socio-demographic characteristics of smallholders. For perceptions of risk sources, the principal component analysis was carried out in designated risk dimensions predefined (i.e. production, market, finance, institution, and human) by the mutual agreement between both experts and key farmers. However, due to the complication of the overlapping effects of risk management strategies, an exploratory factor analysis procedure was used. The latent root criterion (Eigenvalue>1) decides on the number of factors retained for subsequent regression models. The varimax rotation extraction method was selected for the factor matrix. Prior to the factor analysis, Kaiser-Meyer-Olkin (KMO) measure of sample adequacy and Barlett’s test of sphericity were used to check the concordance for the application condition of factor analysis. KMO of at least 0.5 and factor loadings of 0.4 and above were considered significant [13]. Standardized factor scores were saved for subsequent regression analysis. The ordinary least square (OLS) regression for perceived risks and management strategies can be presented as follow:

$$RP_{i,t} = f(X_t, \varepsilon_t) \tag{1}$$

and

$$RM_{j,t} = f(X_t, RP_{i,t}, e_t) \tag{2}$$

...where

$RP_{i,t}$: standardized factor scores for sources of risks ($i = 1, 2, \dots, 7$)

$RM_{j,t}$: standardized factor scores for risk management strategies ($j = 1, 2, \dots, 8$)

X_t : is the set of explanatory variables described in Table 1.

ε_t and e_t are error terms of Eq. 1 and 2, respectively.

The factor analyses were computed by SPSS version 24 and regressions were estimated using Stata version 14. The basic assumptions of OLS were tested for possible violations. Durbin-Watson statistics revealed no problem of first-order autocorrelation. The variance inflation factors (VIF) were calculated to detect any multicollinearity. Heteroscedasticity was checked using the Breush-Pagan test. The regressions that violated the assumption of homoscedasticity of the error terms were re-estimated using the robust standard errors.

Results and Discussion

Demographic and Farm Characteristics

Table 1 delineates the descriptive statistics of the studied sample. The majority of farmers interviewed were male (90.21%). The average age was 48 (in the range of 27-78). The average education attainment was 6 years, most farmers finished elementary and above (58.25%). The average farming experience was 18 years. 91.24% received at least one extension training in the current year. The average farm size was 2.65 ha. About 47% of farmers were a member of a cooperative. 33% of farmers received at least one additional income source besides rice farming.

Table 1. Descriptive statistics of the independent variables.

Variables	Description	Mean	Std. Dev.	Min	Max
Gender	1 if male; 0 if female	0.90	0.29	0	1
Extension	1 if receive training; 0 otherwise	0.91	0.28	0	1
Age	Age of the farmers (years)	48.04	11.04	27	78
Edu	Number of years to school	6.73	2.79	0	16
Exp	Experience in rice farming (years)	18.25	9.93	1	50
Farm size	Area use for rice production (ha)	2.65	1.42	0.5	6
Income diversification	1 if receive additional income beside rice farming; 0 otherwise	0.33	0.47	0	1
Cooperative	1 if farmers are the member of a cooperative; 0 otherwise	0.47	0.50	0	1

Table 2. Mean Scores and Combined Varimax Rotated Factor Loadings for Sources of Risks by Dimensions.

Risk ID	Sources of Risk	Mean	Rank by Mean	Factor Loading: Most Important Factors ^a								
				1	2	3	4	5 ^b	6	7		
1	Low germination rate of seeds	3.42	13	0.81	0.06	0.14						
2	Low yield varieties	3.48	12	0.81	-0.09	0.08						
3	Low pest-resistant varieties	3.25	16	0.78	-0.06	0.12						
4	Seed damage	3.14	18	0.85	0.04	0.04						
5	Mixture of unqualified seeds	3.17	17	0.71	-0.05	0.12						
6	Unmatched sowing schedule	3.68	7	0.74	-0.01	0.16						
7	Poor quality fertilizer	3.68	7	0.80	-0.02	-0.26						
8	Poor quality pesticide	3.75	5	0.82	-0.05	-0.18						
9	Delay delivery of inputs supply	2.94	22	0.44	-0.14	-0.20						
10	Pest and diseases of plants	3.3	14	-0.05	0.32	0.85						

Table 2. Continued.

11	Heavy rain	2.97	20	0.07	0.80	-0.32				
12	Drought	2.38	27	0.08	0.81	-0.27				
13	Storm	3.26	15	0.05	0.81	0.25				
14	High and fluctuating input price	3.77	3			0.69				
15	The instability of inputs supply	4.06	2			0.87				
16	Low and unstable selling price	4.22	1			0.74				
17	Market inaccessibility	3.09	19			0.63				
18	Difficult to access to credits from banks/credit institutions.	1.96	28			0.90				
19	High interest rate for loans	2.43	26			0.90				
21	Changes in government policy on product development strategy	2.81	24					0.89		
22	Changes in regulations on food safety and/or clean production practice	2.9	23					0.84		
23	Changes in tax policy	2.97	20					0.79		
24	Lack of knowledge and experience in applying fertilizer/pesticide	2.63	25						0.85	
25	Lack of knowledge and experience in market accessibility	3.51	11						0.85	
26	Lack of awareness about health protection (in pesticide use)	3.72	6						0.86	
27	Lack of awareness on environmental protection	3.77	3						0.82	
28	Hired laborers are lack of skills and experience in rice production	3.67	9						0.65	
	Eigenvalues			5.28	2.09	1.21	2.20	1.62	2.13	3.30
	% of variance explained			40.66	16.08	9.35	55.02	81.33	71.12	66.12

^a Factors 1 to 7 are: Input & sowing; Climatic conditions; Pest & Disease; Market; Financial; Institutional; Human. Loadings of 0.4 are in bold.

^b Risk item 20 (delay in payment from the buyers/contractors) was omitted due to low reliability coefficient of below 0.5.

Note: Factors are reduced and rotated within their designated risk dimensions (i.e. production, market, finance, institution, and human) and are collectively presented to facilitate data visualization.

Perceptions of Risk Sources

In total, 28 sources of risk were analyzed. To measure farmers' perceptions about the impacts of risks on their income and productivity, we adopted a 7-point Likert scale ranging from 1 – very low impact to 7 – very high or severe impact.

The second and fourth columns of Table 2 show the names and ranks of risk factors, respectively, by dimensions. Table 3 illustrates detailed means, standard deviations, and corresponding ranks by mean in the decreasing order in terms of the magnitude of impacts.

Surprisingly, small rice farmers in the region seem to experience favorable farming conditions, as a result, their risk perceptions only range from moderate concern (average score 4.0-5.0) to low concern (average score 3.0-4.0), and very low concern (average score <3.0).

The first cluster consists of low and unstable selling price, and the instability of inputs supply, with average scores of 4.22 and 4.06, respectively. Volatile selling prices were identified as the top-ranked source of risk as about 40% of farmers perceived this risk is of great concern (score 6-7). This is similar to fish farming [4,5]. Selling prices have always been and will continue to be of great concern for rice farmers, particularly for those without contractual partnerships [14]. For the

Table 3. Means, Standard Deviations and Ranks of Risk Sources.

Risk ID	Sources of Risk	N	Mean	Std. Dev.	Rank by Mean
16	Low and unstable selling price	194	4.22	2.23	1
15	The instability of inputs supply	194	4.06	2.16	2
14	High and fluctuating input price	194	3.77	1.97	3
26	Lack of awareness about health protection (in pesticide use)	194	3.77	2.01	3
8	Poor quality pesticide	194	3.75	2.10	5
25	Lack of knowledge and experience in market accessibility	194	3.72	1.86	6
6	Unmatched sowing schedule	194	3.68	2.03	7
7	Poor quality fertilizer	194	3.68	2.01	7
27	Lack of awareness on environmental protection	194	3.67	1.97	9
28	Hired laborers are lack of skills and experience in rice production	194	3.56	2.11	10
24	Lack of knowledge and experience in applying fertilizer/pesticide	194	3.51	2.1	11
2	Low yield varieties	194	3.48	2.19	12
1	Low germination rate of seeds	194	3.42	2.28	13
10	Pest and diseases of plants	194	3.3	2.2	14
13	Storm	194	3.26	2.22	15
3	Low pest-resistant varieties	194	3.25	1.90	16
5	Mixture of unqualified seeds	194	3.17	2.17	17
4	Seed damage	194	3.14	2.01	18
17	Market inaccessibility	194	3.09	1.9	19
11	Rain	194	2.97	2.1	20
22	Changes in regulation on food safety and/or clean production practice	194	2.97	1.65	20
9	Delay delivery of inputs supply	194	2.94	1.93	22
21	Changes in government policy on product development strategy	194	2.9	1.6	23
20	Delay in payment from the buyers/contractors	194	2.81	1.88	24
23	Changes in tax policy	194	2.63	1.81	25
19	High interest rate for loans	194	2.43	1.82	26
12	Drought	194	2.38	1.86	27
18	Difficult to access to credits from banks/credit institutions	194	1.96	1.72	28

second-most impactful risk – input supply, about 37% of farmers perceived this risk as of great concern. Due to the characteristics of smallholders, farmers often can not reap the benefit of discount from large orders from big suppliers, which force them to depend on multiple small and local suppliers with limited capacity.

The second cluster includes 17 sources of risk with the average scores ranging from 3.09 to 3.77 and rank from 3 to 19 on the list. The next 9 sources of risk with scores from 1.96 to 2.97 with corresponding ranks of 20 to 28 constitute the third cluster of risks (see Table 3 for the full list of risk ranking).

In the second cluster, high and fluctuating input price secures the third-most important spot. The underlying reason might also be shared with the second-most important source. Small farmers hardly order inputs in bulk in order to secure the purchasing prices, thus buying on-demand always accompanies float prices. The two next critical sources of risk involve awareness about health protection in pesticide use and poor quality pesticide. Similar to Thailand [15], applying excessive quantities of synthetic pesticides to control the risk of pests and diseases has been ubiquitous in Vietnam. In spite of the obvious risk-increasing effects of pesticide and insecticides [16-18], farmers' awareness of health risks are relatively low in accordance with neglecting safe handling practices. In fact, about 74% of farmers considered this source of risk moderate to low, which could lead to underestimation of mitigation strategies. On the contrary, 72% of studied farmers were relatively confident in the quality of pesticides used by rating the risk of using poor quality pesticides between moderate to very low. This might hint that farmers either are knowledgeable about pesticides or most pesticides out there in the market are very "effective". Either way, inefficient overuse of pesticides could indeed be promoted, which is in line with recent studies [18, 19].

To enter into further analysis of the perceived risks of rice farmers, a total of 28 risk sources was reduced using the varimax rotation factor analysis by their designated dimensions. The suitability of the application conditions was tested using KMO measure of sample adequacy and Barlett's test of sphericity. The KMO measure of sample adequacy for each risk dimension was production risk (0.82), market risk (0.68), financial risk (0.50), institutional risk (0.67), and human risk (0.79) and Barlett's test of sphericity was all significant at 1% level. These results denote data qualification for factor analysis [13]. The latent root criterion (Eigenvalues>1) suggested the use of three factors explaining the production risk with a total variance explained of 66.10%. Each remaining risk dimension is reduced into one sole factor with the total variance explained of market risk (55.02%), financial risk (81.33%), institutional risk (71.12%), and human risk (66.12%).

Factor 1-7 can best be interpreted as: "input and sowing"; "climatic conditions"; "pest and disease";

"market"; "financial"; "institutional"; and "human". Factor 1, input and sowing, comprises of risk items related to input and sowing issues. Variables such as low germination rate of seeds, low yield varieties, seed damage, and poor quality fertilizer/pesticide load significantly on this factor. Factor 2 reflects natural hazards including heavy rain, drought, and storm. Factor 3 loads significantly and solely from the risk item of pest and diseases of plants. Factor 4, market, has high loadings on high and fluctuating input price, the instability of inputs supply, low and unstable selling price, and market inaccessibility. Factor 5 consists of high loading risk items related to financial issues. Heavy loadings of institutional risk items constitute Factor 6. Factor 7 comprises of human-related risk items.

Perceptions of Risk Mitigation Strategies

In this research, 22 risk mitigating strategies were investigated. The efficacy of risk management strategies was rated on a 7-point Likert scale with 1 as absolutely not effective and 7 as absolutely effective.

The descriptions and ranks of risk management strategies can be found in the second and fourth columns of Table 4. Detailed descriptive statistics such as means, standard deviations, and ranks are presented in the descending order of magnitude in Table 5. Management strategies were classified into four clusters of very efficient (average score>6.0), highly effective (average score 5.5-6.0), moderate (average score 4.0-5.5), and minimally efficient (average score<4.0).

The first cluster incorporates make use of the combined harvester, and adoption of certified varieties with average scores of 6.63, and 6.38, respectively. The second cluster involves five mitigating strategies with average scores ranged from 5.52 to 5.87 and are agreed as highly effective in alleviating risks. The next 13 strategies fall into the third cluster with average scores ranged from 4.35 to 5.48. Cooperative/farmer-group participation and ensure credit arrangement before cropping constitute the last cluster with average scores of 3.47 and 3.21, respectively.

92.78% of farmers perceived the usefulness of the combined harvester as a very efficient and most important risk-mitigating strategy. This provides evidence on the risk-abating role of the combined harvester, particularly to solve the risk of unmatched sowing schedule and potentially increase the harvesting speed in case of unfavorable natural hazards such as storm or flood, which, in turn, results in minimal losses.

The second-most important risk-reducing strategy is the adoption of certified varieties – a very efficient measure, which was agreed by 89.18% of farmers. Rice yield of An Giang province was on average 6.25 ton/ha among the highest group in the Mekong Delta [20]. This connects to the fact that farmers understand the essential role of sowing certified varieties. Next, selecting prestigious partners, either buyers or contractors, was perceived as highly effective by 73.71% of farmers

Table 4. Mean Scores and Joint Varimax Rotated Loadings for Risk Management Strategies.

RM ID	Risk Management Strategies	Mean	Rank by Mean	Factor Loading: Most Important Factors ^a							
				1	2	3	4	5	6	7	8
1	Adoption of certified varieties (according to technical guidance)	6.38	2	0.02	-0.07	0.01	-0.01	0.10	-0.06	0.05	0.87
2	Contract participation	4.99	16	-0.10	-0.04	0.19	0.03	-0.06	0.22	0.79	0.02
3	Cooperative/farmer-group participation	3.47	21	0.16	-0.03	0.04	-0.01	0.08	-0.12	0.78	0.02
4	Complying with crop calendars provided by extension agents/agricultural office	5.36	9	0.62	0.25	0.28	0.11	-0.11	0.23	0.12	-0.13
5	Matching production schedule with neighbor-farms	5.68	5	0.34	0.56	0.23	0.13	-0.21	0.08	0.02	-0.07
6	Proper financial planning	4.68	18	0.12	0.00	0.05	0.86	0.18	0.10	0.14	-0.08
7	Keep cash on hand for farming	4.44	19	0.01	0.14	0.08	0.85	0.00	-0.09	-0.12	0.14
8	Regularly attend extension trainings	5.15	14	0.10	0.19	0.79	0.17	0.18	0.01	-0.04	0.06
9	Joining technical trainings provided by input suppliers/companies	5.27	11	0.23	0.08	0.77	-0.07	0.09	-0.03	0.33	0.04
10	Make use of the combined harvester	6.63	1	-0.19	0.74	0.18	0.00	-0.14	0.02	-0.05	0.09
11	Applying technical guidance from extension agents/agricultural office (e.g. drain the field 10 days before harvesting)	5.04	15	0.52	0.08	0.40	0.10	0.06	0.26	0.20	-0.09
12	Regularly check market price	5.48	8	0.34	0.62	0.04	0.09	0.18	0.28	-0.02	-0.07
13	Regularly update market information via different channels (e.g. friends, farmers, cooperatives/farmer-group...)	5.25	12	0.37	0.61	0.01	0.07	0.25	0.08	0.00	-0.04
14	Regularly check and adjust farming practices	4.35	20	0.05	0.22	0.12	0.26	0.72	0.09	-0.01	-0.05
15	Strictly follow government regulations and technical guidelines	5.52	7	0.40	0.37	-0.19	0.04	0.20	-0.07	0.37	0.35
16	Carefully select prestigious partners (i.e. contractors, buyers)	5.87	3	0.61	0.14	-0.02	0.12	-0.22	0.24	-0.05	0.25
17	Ensure credit arrangement before cropping	3.21	22	0.05	-0.15	0.11	-0.02	0.73	0.14	0.05	0.07
18	Using climate-adaptive varieties	5.66	6	0.26	0.13	0.33	0.20	-0.24	0.28	-0.02	0.49
19	Strictly comply with pesticide application procedures from the government	5.36	9	0.77	0.07	0.22	-0.06	0.13	0.02	-0.01	0.06
20	Increase investment in environmental protection	4.89	17	0.66	0.03	-0.01	0.05	0.44	-0.08	0.07	0.10
21	Using skillful and knowledgeable laborers	5.18	13	0.34	0.08	0.03	0.24	0.18	0.68	0.06	0.06
22	Increase the percentage of mechanization	5.74	4	0.01	0.14	0.01	-0.15	0.09	0.83	0.01	-0.04
	Eigenvalues			5.05	1.79	1.66	1.48	1.38	1.19	1.07	1.05
	% of variance explained			22.97	8.15	7.56	6.75	6.29	5.43	4.86	4.77

^a Factor 1-8 are: Production compliance; Production-market tuning; Technical training; Financial management; Farming adjustment; Mechanization; Cooperation; and Seed selection. Loadings of 0.4 are in bold

Table 5. Means, Standard Deviations and Ranks of Risk Management Strategies.

RM ID	Risk Management Strategies	N	Mean	Std. Dev.	Rank by Mean
10	Make use of the combine harvester	194	6.63	0.82	1
1	Adoption of certified varieties (according to technical guidance)	194	6.38	0.94	2
16	Carefully select prestigious partners (i.e. contractors, buyers)	194	5.87	1.62	3
22	Increase the percentage of mechanization	194	5.74	1.76	4
5	Matching production schedule with neighbor-farms	194	5.68	1.29	5
18	Using climate-resistant varieties	194	5.66	1.58	6
15	Strictly follow government regulations and technical guidelines	194	5.52	1.48	7
12	Regularly check market price	194	5.48	1.43	8
4	Complying with crop scheduling provided by extension agents/agricultural office	194	5.36	1.83	9
19	Strictly comply with pesticide application procedures from the government	194	5.36	1.57	9
9	Joining technical trainings provided by input suppliers/companies	194	5.27	1.54	11
13	Regularly update market information via different channels (e.g. friends, farmers, cooperatives/farmer-group...)	194	5.25	1.51	12
21	Using skillful and knowledgeable laborers	194	5.18	1.62	13
8	Regularly attend extension trainings	194	5.15	1.69	14
11	Applying technical guidance from extension agents/agricultural office (e.g. drain the field 10 days before harvesting)	194	5.04	1.73	15
2	Contract participation	194	4.99	1.92	16
20	Increase investment in environmental protection	194	4.89	1.66	17
6	Proper financial planning	194	4.68	1.8	18
7	Keep cash on hand for farming	194	4.44	1.91	19
14	Regularly check and adjust farming practices	194	4.35	1.87	20
3	Cooperative/farmer-group participation	194	3.47	2.17	21
17	Ensure credit arrangement before cropping	194	3.21	2.05	22

to mitigate a wide range of risk concerns which mostly derived from input and output issues. The results beef up the evidence of the success of the contract farming scheme being promoted by the local and central government [14]. A plausible hint for policy-makers is to involve reputable and trusted companies in designing and promoting related agricultural policies in terms of risk mitigation. Mechanization was the next perceived important strategy. Among Mekong Delta regions, the current percentage of mechanization applied in An Giang was reported as tillage and irrigation (95%), sowing (48%), harvesting (42%) which are also among leading provinces in the country [21]. According to local experts and key farmers, despite the high integration of machinery in rice farming, the current technologies applied are not cutting-edge, let alone left-out phases such as sowing, pesticide spraying, etc. For that reason, the integration of mechanization should be both horizontal in terms of its coverage of all phases of farming, and vertical with reference to modernness of new techs such as AI, big data, and drones to unlock

their power to the fullest potential, to facilitate further automation farming.

Matching production schedules with neighbor farms secured the next important position on the list. This management strategy is the solution to cope with production risks and to leverage nearby human resources. Farmers often follow crop calendars and technical guidance provided by local extension agents which were set out in accordance with changes consulted with scientists and policy-makers to facilitate not only the quality and productivity of the crop but also to meet the consumption demand serving domestic and export needs aligned with government orientation. Besides, simultaneous production also means utilizing resources more efficiently such as labor, machinery, and knowledge sharing, let alone enjoying the economies of scale on input purchasing or output selling.

Regarding input purchasing, farmers were well-aware of the severe impact of climate change in recent years, particularly the harshest saline intrusion in the history in the current year, which explains why the use

of climate-adaptive varieties was considered among highly effective strategies.

Similar to the analysis of risk sources, 22 risk management strategies were reduced into 8 risk management factors using factor analysis and orthogonal rotation method. In this vein, the application conditions were also checked. The KMO measure of adequacy was 0.72, and Bartlett's test of sphericity was significant at the 1% level. These results satisfy the application conditions. The latent root criterion suggested 8 factors (total variance explained of 66.82%). Factors 1-8 were grouped into: "production compliance"; "production-market tuning"; "technical training"; "financial management"; "farming adjustment"; "mechanization"; "cooperation"; and "seed selection".

Factor 1, production compliance, is contributed by variables regarding the compliance of production practices such as complying with crop calendars and applying technical guidance provided by extension/agricultural office, strictly follow pesticide application procedure, and investment in environmental protection, strictly follow government regulations and technical guidelines, and carefully select prestigious partners.

Factor 2 is labeled production-market tuning because of the heavy loadings of matching production schedule with neighbor-farms, regularly update market information, regularly check the market price, and make use of the combined harvester. Factor 3, technical training, includes high loadings of the following variables: regularly attend extension training, joining technical training provided by input suppliers/companies. Factor 4, financial management, represents financial practices such as proper financial planning, and keep cash on hand for farming. Factor 5 is considered as farming adjustment because it involves the heavy loadings of regularly check and adjust farming practices, investment in environmental protection, and ensure credit arrangement before cropping. It is also worth noting that some high cross-loadings of applying technical guidance from extension/agricultural office and increase investment in environmental protection were observed. This implies that the application of technical guidance from the extension/agricultural office plays a key role in the production process. Also, farmers should incorporate environmental protection practices into the production process and constantly

Table 6. Regression Results for Sources of Risk.

Independent variables	Sources of Risk						
	Input & sowing	Climatic Conditions	Pest & Disease ^b	Market	Financial ^b	Institutional ^b	Human
Gender	0.317 (0.242)	-0.239 (0.245)	-0.186 (0.218)	0.418* (0.242)	0.105 (0.206)	0.111 (0.244)	-0.323 (0.249)
Extension	-0.015 (0.253)	0.240 (0.256)	-0.186 (0.220)	0.161 (0.254)	0.059 (0.264)	0.361 (0.245)	-0.001 (0.261)
Age	-0.011 (0.008)	-0.003 (0.008)	0.022** (0.007)	-0.009 (0.008)	0.0007 (0.008)	-0.014** (0.006)	0.006 (0.008)
Edu	-0.016 (0.027)	0.012 (0.028)	0.028 (0.026)	-0.077*** (0.027)	-0.054** (0.022)	-0.053** (0.025)	0.040 (0.028)
Exp	0.014* (0.008)	-0.015* (0.008)	-0.025** (0.008)	0.003 (0.008)	-0.002 (0.007)	0.012* (0.007)	0.008 (0.008)
Farm size	-0.090* (0.052)	0.074 (0.053)	-0.057 (0.050)	0.044 (0.052)	0.012 (0.051)	-0.111** (0.050)	-0.055 (0.053)
Income diversification	0.351** (0.165)	0.119 (0.167)	-0.071 (0.166)	0.312* (0.165)	-0.065 (0.167)	0.325* (0.169)	0.088 (0.170)
Cooperative	-0.051 (0.145)	0.272* (0.147)	-0.192 (0.143)	-0.069 (0.145)	-0.023 (0.156)	0.022 (0.153)	0.086 (0.150)
Constant	0.302 (0.563)	-0.009 (0.570)	-0.177 (0.506)	0.200 (0.564)	0.218 (0.496)	0.549 (0.539)	-0.376 (0.580)
R-squared	0.089	0.068	0.098	0.087	0.025	0.094	0.034
R-squared adjusted	0.050	0.028	0.059	0.048	0.016	0.055	0.007
Durbin-Watson statistics	1.025	1.498	1.430	1.599	1.609	1.251	1.222
Breusch-Pagan test ^a	0.06 (0.800)	2.22 (0.136)	2.96 (0.085)	0.46 (0.496)	4.18 (0.040)	9.38 (0.002)	0.04 (0.848)

Standard Errors in parentheses.

Asterisks *, **, *** denote levels of significance of 10%, 5%, and 1%, respectively.

^a Breusch-Pagan statistics of the original regressions and p-values are in parentheses.

^b White consistent standard error and covariance estimation.

adjust these environmental-friendly farming practices to resolve related risks. Factor 6, mechanization and human, is derived from the heavy loadings of increase the percentage of mechanization and using skillful and knowledgeable laborers. Contract participation and cooperative/farmer-group participation constitute Factor 7, cooperation. Finally, Factor 8 - seed selection, addresses the adoption of certified varieties, and the use of climate-adaptive varieties.

Relationship between Risk Perceptions and Socio-Demographic Characteristics

Table 6 illustrates the regression results. R^2 of all models were relatively small, ranging from 0.02 to 0.09. This is analogous to previous empirical risk perception studies [4,5].

VIFs ranged between 1.05 and 1.64, indicating that multicollinearity was not a problem. The Breusch-Pagan test denotes the rejection of the null hypothesis of homoscedasticity of the equation for factors “Pest and diseases”, “financial”, and “institutional”. Hence, robust standard errors were applied to re-estimate these equations. Durbin-Watson statistics of all models ranged between 1.02 and 1.60, confirms the absence of the first-order autocorrelation problem.

The regression results revealed that male farmers were more sensitive to market risks than their female counterparts. The nature of farming in agriculture requires lots of physical labor which entitled to be the duty of the male heads, which also provides them the power to make major decisions such as buying inputs and selling outputs. This responsibility explains why male farmers tend to be more sensitive to market risks to fulfill their duties.

Regarding age, older farmers tended to perceive greater production risk, in this case, pest and disease risk, than younger farmers. However, older farmers were less aware of the institutional risks than younger ones. These findings are consistent with the case of catfish farming [4] but contrast the case of rice farming in Bangladesh [3].

Farmers with lower education perceived more of market, financial, and institutional risks. This contrasts the situation in Bangladesh where farmers with a higher education focus more on market risk [3]. Interestingly, in the production risk category, more experienced farmers perceived more of the input and sowing risk and institutional risk while less of climatic risks and pest and disease risks. Perhaps, local farmers have experience in dealing with natural hazards and pest and disease issue – analogous to the case of Pakistan farmers [22,23], however, lack of the capability to control institutional issues and input-sowing related risks such as unable to obtain quality pest-resistant varieties or quality pesticide or fertilizer. Given small farmers in this study, farmers with lesser farm sizes discern riskier at input and sowing and institutional risks. Indeed, more experienced farmers with smaller

farm sizes were more risk-averse than those with less experience but with larger farms. In other words, ones with more constrained resources tend to be more cautious in decision-making regarding uncertainties. The results also demonstrated that farmers who had off-farm income perceived more of input and sowing, market, and institutional risks. In this situation, income diversification might be one of the coping solutions chosen similar to the situation reported in Bangladesh [3,8,24]. Being a cooperative member helps to reduce other production risk perceptions, however resulted in exacerbating the perception of climatic risks. This was probably because of the propaganda of the impact of climate change via the cooperative or farmer groups; and that while technical knowledge dissemination mitigates potential production risks, climate risks are uncontrollable.

Relationship between Risk Management Strategies and Risk Perceptions and Socio-Demographic Characteristics

Table 7 presents the regression results of the analysis. R^2 of all models were between 0.09 to 0.51. VIFs showed no existence of the multicollinearity problem, varying between 1.07 and 1.75.

Durbin-Watson statistics denoted no first-degree autocorrelation. Breusch-Pagan test suggested the re-estimation with White’s consistent robust standard errors on factors “production compliance”, “production-market tuning”, “financial management”, “mechanization”, and “seed selection”.

Regarding gender, female and male farmers develop different viewpoints over the effectiveness of distinct risk management strategies. While female farmers perceived production compliance and production-market tuning as more important, their male counterparts valued more the resort of farming adjustment. Expectably, farmers, who received extension training, expressed a positive perception on the impact of technical training, farming adjustment, and seed selection. These results indicated the effective role of the extension in strengthening farmers’ technical knowledge to tackle risks. The dissimilar impacts of age, education, experience, and cooperative across risk management strategies were also detected. While older farmers evaluated farming adjustment and mechanization as more important, younger ones valued more the crucial role of seed selection strategy. More educated farmers were more conscious of the efficacy of production compliance, financial management, farming adjustment, but less for seed selection. More experienced farmers rated the role of production compliance highly but seem underrated the cooperation strategy. Farmers who were members of a cooperative tended to be more concerned with the impact of cooperation and less with mechanization. This can be explained that small farmers in a cooperative often locate in the same region which facilitates the helping

Table 7. Regression Results for Risk Management Strategies.

Independent variables	Risk Management Strategies							
	Production compliance ^b	Production-Market turning ^b	Technical training	Financial management ^b	Farming adjustment	Mechanization ^b	Cooperation	Seed selection ^b
<i>Farm/farmers characteristics</i>								
Gender	-0.425** (0.168)	-0.373** (0.187)	0.073 (0.242)	-0.073 (0.257)	0.400* (0.236)	-0.060 (0.214)	0.153 (0.183)	-0.047 (0.217)
Extension	0.493 (0.381)	0.072 (0.297)	0.981**** (0.252)	0.157 (0.290)	0.592** (0.245)	0.348 (0.237)	-0.113 (0.190)	0.605** (0.244)
Age	0.0003 (0.007)	-0.003 (0.007)	-0.007 (0.008)	0.005 (0.008)	0.014* (0.008)	0.016** (0.006)	-0.003 (0.006)	-0.017** (0.008)
Edu	0.066** (0.030)	-0.004 (0.029)	0.041 (0.028)	0.052* (0.030)	0.057** (0.027)	0.012 (0.024)	-0.015 (0.021)	-0.067** (0.031)
Exp	0.016** (0.007)	0.003 (0.008)	0.009 (0.008)	0.006 (0.009)	0.010 (0.008)	-0.011 (0.007)	-0.013* (0.006)	0.004 (0.009)
Farm size	-0.038 (0.056)	0.104** (0.049)	0.037 (0.053)	-0.092 (0.059)	0.010 (0.052)	0.028 (0.052)	0.072* (0.040)	-0.056 (0.049)
Income diversification	-0.021 (0.173)	-0.087 (0.159)	-0.125 (0.166)	0.021 (0.186)	0.164 (0.161)	-0.108 (0.154)	-0.396**** (0.125)	-0.007 (0.155)
Cooperative	-0.159 (0.152)	-0.033 (0.144)	-0.096 (0.145)	0.055 (0.150)	0.084 (0.141)	-0.275* (0.143)	1.256**** (0.110)	-0.056 (0.149)
<i>Sources of risk</i>								
1. Input & sowing	-0.084 (0.095)	-0.058 (0.094)	-0.086 (0.084)	-0.146 (0.093)	0.052 (0.082)	-0.232**** (0.083)	-0.145** (0.064)	0.167** (0.082)
2. Climatic condition	0.046 (0.086)	0.0002 (0.078)	-0.014 (0.071)	-0.140* (0.078)	-0.060 (0.069)	-0.084 (0.073)	0.071 (0.054)	0.156** (0.068)
3. Pest & disease	0.005 (0.071)	0.006 (0.072)	-0.051 (0.074)	-0.138 (0.090)	0.071 (0.072)	0.133* (0.073)	-0.042 (0.056)	0.044 (0.073)
4. Market	-0.075 (0.101)	0.134 (0.104)	-0.026 (0.084)	0.139 (0.087)	0.038 (0.082)	0.026 (0.079)	-0.029 (0.064)	-0.200** (0.084)
5. Financial	0.122* (0.072)	-0.075 (0.076)	-0.103 (0.073)	0.025 (0.075)	0.027 (0.071)	0.146** (0.069)	-0.043 (0.055)	-0.069 (0.064)
6. Human	0.089 (0.068)	-0.103* (0.057)	-0.001 (0.073)	-0.051 (0.075)	-0.307**** (0.071)	0.060 (0.075)	0.120** (0.055)	0.142** (0.068)
7. Institutional	0.170* (0.087)	-0.093 (0.099)	-0.009 (0.078)	-0.054 (0.097)	0.124 (0.076)	0.056 (0.092)	-0.057 (0.059)	0.018 (0.075)

Constant	-0.654 (0.554)	0.171 (0.549)	-1.046* (0.557)	-0.630 (0.606)	-2.278*** (0.542)	-0.854* (0.485)	-0.152 (0.422)	0.887 (0.622)
R-squared	0.154	0.094	0.153	0.094	0.197	0.204	0.513	0.147
R-squared adjusted	0.082	0.018	0.082	0.018	0.130	0.137	0.472	0.075
Durbin-Watson statistics	1.775	1.726	1.834	1.924	1.385	1.813	1.561	2.027
Breusch-Pagan test ^a	21.51(0.000)	21.19 (0.000)	0.16 (0.689)	2.92 (0.087)	0.02 (0.891)	3.74 (0.053)	1.63 (0.201)	17.71 (0.000)

Standard Errors in parentheses.

Asterisks *, **, ***, **** denote levels of significance of 10%, 5%, and 1%, 0.1% respectively.

^a Breusch-Pagan statistics of the original regressions and p-values are in parentheses.

^b White consistent standard error and covariance estimation.

mechanism for a win-win relationship such as physical labor sharing which overcome the need for expensive machinery that they could not afford. The cooperation seems stronger proportionate with the increase in farm size. Also, larger farms were more aware of adjusting/tuning up their production practices to adapt to changes happening in the market. The negative coefficient of income diversification reinforced the fact that full-time farmers understand the importance of cooperation as a risk management strategy, perhaps because their livelihood greatly depends on the sole source of income, similar to the case of shrimp farmers in Bangladesh [8].

Studies have shown that risk perceptions significantly influence not only economic behaviors but also risk-mitigating decisions regarding perceived risks [4, 5, 8]. Similar to these studies, this research confirms the multidimensional aspect between risk perceptions and management strategies, meaning multiple strategies are required to mitigate a certain risk source and multiple risk perceptions drive the application of a specific risk management strategy.

It is reasonable to expect that seed selection influences input and sowing risk directly. However, counterintuitively, farmers who perceived the important role of input and sowing risk tended to underestimate the effectiveness of mechanization and cooperation strategies. Given that the input and sowing risk is constituted majorly by input risks (as presented in Table 2), which deems uncontrollable, the problem is unraveled. The perceived impact of the climatic condition on the perceptions of financial management and seed selection unveiled farmers' preferences of coping strategies in favor of selecting certified and climate adaptive varieties and neglecting the financial management strategy. Local farmers seem to underestimate the role of financial management strategy, which is useful for solving the consequences of natural hazards. Next, the perceived impact of pest and diseases could drive the decision of increasing the percentage of mechanization, especially machine-aid pest control. Regarding the perception of market risk, seed selection was apparently one of the least important and relevant strategies to deal with market risk. The regression results further suggested that farmers dealing with financial risk would strictly comply with good production practices and tend to integrate more mechanization into farming because they have to maximize their sole income source to tackle the problem of external financial inaccessibility. Perceived human risk has a negative impact on production-market tuning and farming adjustment but positive on cooperation and seed selection strategies. The increasing impacts of human risk might incite farmers to endorse more cooperation and seed selection practices. More cooperation to compensate for the lack of skills and experience is understandable, how about seed selection? Connecting the dots, choosing certified and climate-resistant varieties directly abridge

other production risks (i.e. input and sowing, climatic condition) which somehow relax the constraints on required labor competency. Last, the ascending impact of institutional risk urged the perceived importance of the production compliance strategy. This showcases farmers' awareness of on-going policy changes and their pivotal roles in the production process.

Conclusions and Limitations

The objective of this present study is to provide empirical insights into Vietnamese rice farmers' perceptions of risk and risk management strategies and the relationship between these factors with farmers' sociodemographic characteristics.

The results highlighted the most important impacts of the low and unstable selling price, the instability of inputs supply, high and fluctuating input price, lack of awareness about health protection in pesticide use, and poor quality pesticide. On the other hand, make use of the combined harvester, adoption of certified varieties, selecting prestigious partners, mechanization, matching production schedule with neighbor-farms, and using climate-adaptive varieties were perceived as the most important mitigation strategies to sustain farmers' income and productivity.

The regression analysis also provided evidence on the significant influences of selected sociodemographic characteristics on the perception of risks and management strategies. The discrepancy of impacts of sociodemographic characteristics on risk perceptions and management reflected the complicated decision patterns of separate farmers made toward certain risks and their mitigation options. Notably, farmers' opting for a specific management strategy was fueled by multiple risk perceptions, either positive or negative. The results further confirmed the findings of recent risk studies [2,5,6]. This also concludes that there is no 'one size fits all' approach suitable to promote the adoption of a certain risk management strategy. For that reason, tailored policies are needed to promote distinct risk management strategies.

The first limitation is derived from this conclusion that the readers might want to take caution in generalizing or interpreting this finding as it is highly contextual. Furthermore, this research is limited in its cross-sectional data collection method and the studied target was smallholders only. Moreover, based on the low R^2 of models, there are still many other left-out potential predictors that future researchers would want to look at such as descriptive norms, prescriptive norms, and many more.

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Conflict of Interest

The authors declare no conflict of interest.

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