

Are Spatial Factors Important in the Adoption of Eco-Friendly Agricultural Technologies? Evidence on Integrated Pest Management (IPM)

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Abstract

Past studies on the adoption of integrated pest management (IPM), analyzed the significance of non-spatial factors (social, economic, institutional and management factors etc.) in influencing farmers' decision to adopt IPM while the present study analyzed spatial factors in addition to these non-spatial factors to address the questions-i. Do the spatial factors significantly influence the farmers to adopt IPM? If yes, then to what extent they do affect IPM adoption? The data were collected from 331 vegetable farmers of Narsingdi district, Bangladesh, by conducting a household survey. Farmers' nineteen characteristics under five broad groups, namely social, economic, institutional, management and spatial factors were analyzed. The result of the binary logistic regression model revealed that two spatial factors namely the distance of farmers' house from the nearest market and the distance from agriculture office, along with some specific social, economic, institutional and management factors, significantly influenced the farmers' to use IPM. It is also observed from the model that the role of spatial factors was important in influencing IPM adoption. However, with regard to the level of importance, their contribution was less than those of economic and institutional factors but more than those of social and management factors. The influences of these factors in practicing IPM are discussed individually as well as group based. The findings show significance in domestic policy making.

Keywords

Spatial Factors, Adoption, IPM, Logistic Regression Model

1. Introduction

In Bangladesh, the agricultural sector has made an impressive contribution over

the last three decades in terms of food production despite the adverse condition. Food production has increased three times in 2012 from 1980 though the land use was declining by 1% per year [1] [2]. Various agricultural inputs, especially pesticides played an important role in this progress as pests (insects, pathogens, weeds etc.) are the most important threats to food production and pesticides are very effective to control pests. However, the use of chemical pesticides for controlling pests is very risky since they pollute environment by contaminating the soil, ground and surface water. Moreover, the resistance of pest, the existence of new pests and the destruction of useful insects are also the consequences of pesticide overuse. Therefore, to keep the trend of increasing food production without harming the environment, the government has promoted integrated pest management (IPM).

IPM has no fixed definition. [3] analyzed a number of definitions of IPM and commented that environmental safety is the focus of all the given definitions. In general IPM is an approach where pests are controlled by following a number of technologies that can be categorized as mechanical control, cultural, biological, chemical control etc. The technologies or practices used in IPM are environmentally friendly. In this approach, chemicals are only used when there is no alternative or when the pest infestation exceeds economic threshold level. Since the farmers who adopted IPM prefer to control pest by applying some technologies which are non-chemicals thus they can reduce the use of pesticides. Furthermore, through the successful application of IPM technologies, farmers can ensure to obtain the desired yield. Due to these advantages, IPM is getting popular day by day as a better alternative for both developed and developing countries.

On the realization of the need of IPM in Bangladesh, the government with the assistance of FAO had launched IPM program for vegetables farmers more than one decade ago. From that period, the Department of Agricultural Extension (DAE), the prime and largest agricultural organization, with the support of various non-government organizations (NGO), international agencies and development banks, has disseminated information on IPM [4] [5]. The goal of this effort is to promote the adoption of IPM by vegetable farmers. Though the government, with the help of various organizations, has been trying to increase the adoption of IPM, but how do farmers make their decision or what are the factors that influence their decision to adopt this eco-friendly approach is not studied.

Studies have been conducted to justify the profitability of IPM and the effectiveness of IPM dissemination techniques in Bangladesh [6] [7] [8] [9] [10]. These studies have attempted to justify whether IPM is profitable or not and they have identified the most effective IPM dissemination techniques. However, they have yet to explore the factors that influence farmers to decide to adopt IPM. On the other hand, studies on determinants of the adoption of IPM have been conducted in different countries. The results showed that IPM adoption is usually influenced by various social, economic, institutional, and management factors [11]-[16]. However, the results of those studies varied across the countries. Moreover, those studies generally overlooked spatial factors that are believed to affect agricultural technology adoption [17] [18] [19] [20]. As the adoption is complex and related to various factors, it is therefore necessary to conduct a study with farmers' spatial characteristics besides others. By considering this fact, the study attempted to identify the factors that have important impact on vegetable farmers' use of IPM. Five broad types of factors such as social, economic, institutional, management and spatial were examined in the study. Since spatial factors were considered as a new dimension, thus this study examined not only they are important or not but also make a comparison between their importances with others. Therefore, the objectives of the study are to identify the factors that significantly influence vegetable farmers' IPM adoption and to assess the spatial factors influence in the adoption of IPM.

2. Theoretical Background

2.1. Adoption of IPM

Adoption is "the mental process an individual passes from first hearing about an innovation to final adoption" [21]. This indicates that adoption is not an instantaneous act rather a process that occurs over time. Farmers may not accept an innovation immediately after hears; they need time for thinking over things to reach a final decision. In this time period they pass several stages. According to Rogers, to take decision about an innovation individual as decision maker passes through in five stages namely: knowledge, persuasion, decision, implementation and confirmation. Like any innovation, to adopt IPM, the farmers also go through these stages. However, they are influenced by a number of factors in each stage. Therefore, it can be said that farmers adoption decision is related with various factors.

2.2. Factors Influencing the Adoption of IPM

The decision to adopt any innovation is influenced by the information receivers' socio-economic characteristics, the role of change agents or diffusion methods and the characteristics of the innovation [22]. Numerous empirical studies on adoption of agricultural technologies including IPM have corroborated this concept. From his concept as well as previous studies, the factors that have been found to influence growers' decision to adopt agricultural technology including IPM can be categorized into four broad items such as social, economic, institutional and management. The study will consider all these broad categories as well as a new dimension like spatial factors. This is because though spatial factors are not analyzed in adoption of IPM but their influence is studied in case of other agricultural technologies and found significant affect. Therefore, the study will analyze what social, economic, institutional, management and spatial factors influence vegetable growers' adoption of IPM (Figure 1).

2.3. Spatial Factors Influence in the Adoption of Agricultural **Technologies**

The influence of spatial factors were analyzed on various agricultural technologies





Figure 1. Conceptual framework for factors influencing adoption of IPM (Blue shaded indicates the new dimensions).

such as agricultural intensification, organic farming, fertilizer, herbicide, integrated crop nutrient management, improved verity, soil conservation, integrated rice fish farming, land management, crop rotation, tillage etc. (**Table 1**). Among these technologies, some are single in nature while others are as a set of practices like IPM. **Table 1** show that a variety of spatial factors were analyzed on different agricultural technology adoption studies and found a mixed result. In most cases, the impact was statistically significant which implies the importance of spatial factors in technology adoption decision. However, these studies focused on various technologies rather than on IPM. In addition to this, these studies only tested whether the spatial factors were significant or not in farmers adoption decision. The current study attempted to analyze the spatial factors, not only to know whether they are important (significant) or not in the adoption of IPM but also their level of importance.

3. Materials and Methods

Structured questionnaire and Global Positioning System (GPS) were used to collect data from the farmers of Narsingdi district, an intensive vegetable growing region of Bangladesh. By following a multistage sampling technique, twelve villages in Belabo upazila (sub-district) of Narsingdi district were selected for the survey. These villages were selected based on vegetable cultivation intensity, frequency of pesticide application and the existence of IPM program. A total number of 1926 vegetable farmers of the selected villages were obtained from the respective upazila agriculture office considered as population of the study. By considering time and other resources, a total of 331 vegetable farmers were selected as sample, comprising 17% from the total population. These farmers were selected randomly for the interview.

The vegetable farmers nineteen characteristics under five broad categories namely; social, economic, institutional, management and spatial were considered in the study. An in-depth interview based on structured questionnaire was held

Author	Study location	Name of factor	Name of technology	Output
[17]	Nepal	Distance to fertilizer store, Distance to plot	Agricultural intensification	-ve and significant +ve and non-significant
[23] [24]	Cameroon, Honduras	Distance of field from home, Distance to city	Organic agriculture	-ve and significant -ve and non-significant
[25]	Ethiopia	Distance from farm to the market	Herbicide	+ve and significant
[25] [26] [27]	Malawi, Ethiopia, Mozambique	Distance of the plot from the market	Fertilizer	-ve and significant +ve and significant
[28] [29]	Nigeria, Bangladesh	Distance to source of technology, Distance to market, Distance to rice mill and agri. office	Improve variety	-ve and significant -ve and non-significant
[18] [30]	Philippines, Indonesia	Distance to market, Distance to information source and meeting place	Integrated crop management	+ve and significant –ve and non-significant –ve and significant
[31] [32]	Ethiopia, Uganda	Distance to farm from home	Soil conservation	-ve and significant
[33]	Ethiopia	Distance to farm plot from home	Land management	-ve and significant
[34]	Bangladesh	Mean distance of farm plot from household	Integrated rice-fish farming	Non-significant
[35]	Ethiopia	Distance to farm plot, Distance to market	Crop rotation	-ve and non-significant
[35]	Ethiopia	Distance to farm plot, Distance to market	Tillage	+ve and non-significant +ve and significant
[20]	Ethiopia	Distance to market and road, Distance to input and credit office, Distance to agriculture office	Improved forages	+ve and significant –ve and significant +ve and non-significant
[27]	Mozambique	Distance to the market	Mechanization	-ve and non-significant
[27]	Mozambique	Distance to the market	Animal traction	+ve and significant
[23]	Cameroon	Distance from home to field	Integrated soil nutrient management	-ve and significant
[36]	Nigeria	Distance of farmland to farmers home	Improve cassava production	-ve and non-significant
[18]	Philippines	Distance to nearest market	Certified seed	-ve and non-significant
[37] [27]	Cameroon, Mozambique	Distance to field from homestead, Distance to market	Pesticide	+ve and non-significant –ve and non-significant

Table 1. Spatial factors influence in various agricultural technology adoption.	Table 1	 Spatial 	factors	influence	in various	agricultural	technology	adoption.
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with the sample farmers to collect the data related to non-spatial factors or characteristics. The questionnaire was divided into four parts. The first part was related to farmers' social characteristics measured by the variables of age, education, household size and perception towards IPM. The second part highlighted farmers' economic characteristics in terms of the variables such as farm size, area under vegetable cultivation, annual income and land ownership status. The third part evaluated farmers' participation towards institutional support like farmer field school training, contact with extension agent, field day demonstration and membership of IPM club. The fourth and last part measured some of the farmers managerial activities such as the use of improved variety, time spent on the farm per day and the number or type of vegetable grown in a year. On the other hand, spatial data were collected by using a handheld GPS. GPS coordinates were recorded from each of the survey respondent's place of residence and four key locations such as upazila agriculture office, nearest market, pesticide store and national highway (**Figure 2**). Later by using Arc GIS (version 9.3) software, the distance between the farmers' house and these four focal points were measured.

The farmers' nineteen characteristics were treated as independent variables or predictors in the study. Some of these are binary while others are continuous. The dependent variable adoption of IPM is binary in nature. The type and



Figure 2. Map of Belabo upazila, Narsingdi district, Bangladesh showing vegetable growers' house and four key locations (agriculture office, market, pesticide store and highway). measuring techniques of both independent and dependent variable are presented in Table 2. As the dependent variable may have any one option of the two; either the adoption or rejection, then to justify the impact of independent variables on IPM adoption, binary logistic regression model is considered the most appropriate [17] [23]. The model was applied in the study twice. In the first stage, as independent variables, social, economic, institutional and management factors were considered. In the second stage, spatial factors in addition to these were entered. That means the difference between two stages of the logistic regression model is spatial factors where in the first stage these factors are absent and present in the second stage. This was done for better understanding about the effect of spatial factors in the adoption of IPM.

Prior to entering the independent variables into the model, they were checked to identify the colinearity problem. In the first stage, there was no colinearity among the independent variables. As a result all (15) factors were entered in the model. In the second stage, the independent variable (distance of the farmers' house to national highway) was excluded from the model as it shows a high degree of correlation with another independent variable (distance to agriculture office) and a low degree of correlation with dependent variable. Therefore, eighteen independent variables were finally considered to be included into the second stage of the model.

4. Results

4.1. Important Factors in IPM Adoption

The first step of the binary logistic regression model was applied to identify the social, economic, institutional and management factors that significantly influence vegetable farmers to adopt IPM. The -2log likelihood value indicates that the data were well fitted for the model. The result of omnibus test of model chi-square is also reinforced the findings. Nagelkarke r² value is 0.591 which denotes the independent variables explained the model 59%. The model correctly predicted about 86% of the variation in the adoption behavior for the sample farmers.

The model showed 5 variables out of 15 were statistically significant determinants (Table 3). These are perception towards IPM, land ownership status, frequency of extension contact, farmer field school training program and use of improved variety. Among these variables, perception towards IPM, frequency of contact with extension agent and use of improved variety were significant at the 1% level of confidence while others showed significance at the 0.1% level. However, all these variables showed a positive relationship with farmers IPM adoption behavior which indicates the higher these variables the higher the probability of IPM adoption.

4.2. Influence of Spatial Factors in IPM Adoption

Variables name	Туре	Description
Dependent variable ADOPTIPM (Adoption of IPM)	Binary	If farmers adopt IPM practice [1 = Yes, 0 = No]
Independent variables Social factors		
AGE	Continuous	Age of the vegetable farmers head (years)
EDUCATION	Continuous	Number of years of formal schooling (years)
HOSIZE	Binary	Number of household members (person)
PERCEPTION	Binary	If farmers have a favorable perception towards IPM $[1 = Yes, 0 = No]$
Economic factors		
FARMSIZE	Continuous	Total farm size (ha)
VEGAREA	Continuous	Out of total farm size, the area which is used for vegetable cultivation (%)
INCOME	Continuous	Amount of money earned by the family members in a year ('000 BDT)
LANDOWN	Binary	If farmers cultivate his own land [1 = Yes, 0 = No]
Institutional factors		
EXCONT	Continuous	Number of contact by the farmers with the extension agent in a crop season
FFS	Binary	If farmers participate in FFS training program $[1 = Yes, 0 = No]$
FLDAY	Binary	If farmers participate in field day demonstration [1 = Yes, 0 = No]
MEMBIPM	Binary	If farmers are member of an IPM club [1 = Yes, 0 = No]
Management factors		
FARMHOUR	Continuous	Time spent in farm per day (hours)
VARIETY	Binary	If farmers use improved variety [1 = Yes, 0 = No]
VEGETBNO	Continuous	Type or no of vegetable grown
Spatial factors		
DISAGOF	Continuous	Distance of farm house to agriculture office (Km)
DISHWAY	Continuous	Distance of farm house to national highway (Km)
DISMARK	Continuous	Distance of farm house to nearest market (Km)
DISPEST	Continuous	Distance of farm house to nearest pesticide store (Km)

In order to assess the influence of spatial factors, the study again used logistic regression model. In this step, besides social, economic, institutional and man-**Table 2**. Description of the variables used in the analysis.

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agement factors, spatial factors were considered for analyze. The reasons behind consider all the factors in this step is to assess the influence of spatial factors in

the adoption of IPM as well as to make a comparison between their level of influence with others. The -2log likelihood value and other parameters indicate that still the model is valid. Moreover, by adding spatial factors, the validity of the model has increased.

In the second step, the logistic regression model explored seven variables that significantly affect the vegetable farmers to adopt IPM (**Table 4**). These are perception towards IPM, land ownership status, frequency of extension contact, farmer field school training, distance from farmers house to agricultural office, distance from farmers house to the nearest market and use of improved variety. Therefore, the second step of the model explored an increase number of significant factors. Two spatial factors out of four namely distance of farmers house to agricultural office and distance of farmers house to the nearest showed significant impact on the adoption of IPM.

However, the variables that had significant effect on practicing IPM were not same in terms of the level of significance. To compare among them regarding the level of importance, the study used p value (significance) and wald stat as these two parameters indicate how strong the level of significance of an independent variable with the dependent variable [17] [24]. The wald statistics and p value of the significant variables are presented in Table 5. From the table, it was observed that institutional factors were the most important contributors followed by economic, spatial, social and management factors. Alternatively it can be said that the importance of spatial factors in the adoption of IPM was lower than those of economic and institutional factors but higher than those of social

Variables	β	S. E	Wald	Sig	Exp (β)
Perception towards IPM	2.601*	0.795	10.704	0.001	13.475
Land ownership status	2.587**	0.515	25.254	0.000	13.294
Frequency of extension contact	0.177*	0.059	8.976	0.003	1.194
Farmers field school training	2.434**	0.423	33.055	0.000	11.402
Use of improved variety	1.235*	0.386	10.258	0.001	3.438

Table 3. Summary statistics of the first stage of logistic regression model.

-2Log likelihood = 226.605. Omnibus test of model Chi-square value = 10.187 (P < 0.01). Nagelkarke r² = 0.591. Overall percentage of correct prediction = 85.8. * = Correlation is significant at the 0.01 level. ** = Correlation is significant at the 0.001 level.

Table 4. Summary statistics of the second stage of logistic regression model.

Variables	β	S. E	Wald	Sig	Exp (β)
Perception towards IPM	2.815**	0.812	12.017	0.001	16.689
Land ownership status	2.876***	0.559	26.501	0.000	17.737
Frequency of extension contact	0.196**	0.062	9.794	0.002	1.216
Farmer field school	2.645***	0.453	34.173	0.000	14.087
Distance to agricultural office	-0.188*	0.083	5.172	0.023	0.829
Distance to the nearest market	1.521***	0.420	13.134	0.000	4.577
Use of improved variety	1.300**	0.407	10.220	0.001	3.668



-2Log likelihood = 206.990. Omnibus test of model chi-square value = 5.379 (P < 0.05). Nagelkarke r² = 0.639. Overall percentage of correct prediction = 86.7. * = Correlation is significant at the 0.05 level. ** = Correlation is significant at the 0.01 level. ***= Correlation is significant at the 0.01 level.

 Table 5. The logistic regression model showing wald stat and p value (significance) of the significant factors of IPM adoption.

Type of factors	Name of factors	Wald stat	Significance (p value)
Social	Perception towards IPM	12.017	0.001
Economic	Land ownership status	26.501	0.000
T	Farmers field school	34.173	0.000
Institutional	Extension contact	9.794	0.002
Management	Use of improved variety	10.220	0.001
	Distance to the nearest market	13.134	0.000
Spatial	Distance to agriculture office	5.172	0.023

and management factors.

5. Discussion

The effort of the government to disseminate IPM practices will be meaningless if a major portion of the farmers do not adopt these. The study observed that fewer farmers' (30%) adopted these environmentally friendly farming practices. It is important to understand farmers' specific characteristics before disseminating any innovation at farm level. The study had made an attempt to identify the factors that influence vegetable farmer's adoption behavior of IPM. The findings of the study explored that farmers' adoption behavior is influenced by some specific social, economic, institutional, management and spatial characteristics. Under institutional characteristics, the participation in farmer field school (FFS) training program and the frequency of extension contact were significant and positively influenced the vegetable farmers to practice IPM. As using IPM is a technical job, farmers who participated in the FFS training program and who made contact with local extension agent gained more knowledge and skill about IPM. That is why these two institutional supports motivated them more to use IPM technologies than those who were deprived from these facilities. The findings of this study are similar with those revealed by [38] and [39] who asserted that information seeking behavior, such as extension contact or training, are helpful to motivate farmers to adopt sustainable agricultural practices.

Among several social and economic characteristics, the influence of land ownership status and perception towards IPM were important for vegetable farmers to adopt environmentally friendly crop protection practices. The farmers who cultivated their own land and had favorable perception were more inclined to use IPM practices than those who were tenants and had unfavorable perception. Tenant farmers always try to achieve a high profit as they own the land instead of having attracted amount of money. Therefore, they feel that it is a risk to employ new practices. Moreover, they are less interested to adopt IPM when they observed that a major portion of the farmers are not adopting IPM. The farmers who cultivated other land were less interested to cultivate vegetables using the new system [40]. On the other hand, farmers who had unfavorable perception towards IPM were less likely to practice this which is consistent with what [24] affirmed that farmers adopted organic practices as they thought the practices are environmentally sound. Alike these socio-economic characteristics, the use of improved variety had a significant and positive relationship with farmers IPM adoption behavior. This denotes that farmers who used improved variety were more interested to adopt IPM than those who used local variety. The task of collecting improved vegetable variety by the farmers in the study area was not easy. It is logical to assume that the farmers who used improved variety were more extrovert or innovative than those who used local variety. These characteristics may have more influence on improved variety users to cultivate vegetables using environmentally sound technologies such as IPM.

Moreover, the results of the study also showed two spatial dimensions, namely the distance of farmers' house from the nearest market and the distance from agriculture office that were significantly related with farmers IPM adoption behavior. The positive sign of the co-efficient of distance to the market indicated that the vegetable farmers who lived close to the market were less interested to adopt IPM than those who stayed far way. The finding is contrary to what one would generally expect. However, [18] found positive relation between market distance and adoption of integrated crop management technologies. The probable explanation of getting positive sign in the study is that the farmers who stayed close to the market may have more distraction from vegetable farming as they might be spending more time in non-agricultural activities. Moreover, these farmers might think that whatever they produce can be easily sold with very little or no transportation cost. This implies the necessity to arrange meeting or informal discussion with the farmers who stay close to the market in order to make them more aware of the beneficial use of IPM practices.

Another spatial dimension discovered to be also important in logistic regression analysis was farmers' home distance from the agricultural office. The negative direction indicates that farmers whose houses were close to agriculture office were more likely to adopt IPM than those who comparatively stayed far away. The result is quite rational as agriculture office plays the role of information centre. The office is also used as a place for conducting training and holding agricultural fair besides departmental activities. Thus, the farmers who stayed within surroundings of the office can easily and quickly obtain information regarding IPM. The respective officers would also allow them to have discussion regarding the use of IPM which was comparatively difficult for those who stayed far away.

The contribution of spatial factors was higher than social and management factors but lower than economic and institutional factors. The finding is logical. There were continuous studies on determinants of IPM adoption since more than three decades. During this long period, it is very difficult to find a study which does not focused on economic and institutional factors to discover their importance. That is why it can be said that the significance of these factors in the adoption of IPM is well established. A new dimension like spatial factor may less important than these factors. In fact the spatial factor plays a more important role than social and management factors which were considered by several studies.

The contribution of institutional factors was the highest in influencing vegetable farmers' decision to adopt IPM. In Bangladesh, DAE developed some approaches such as farmer field school training program, field day demonstration, movement of extension agent and establishment of IPM club for disseminating and implementing IPM technologies. Besides, the organization used mass media (electronic and print) to speed up these activities. This study considered all the above mentioned approaches except for the mass media. The reason is that farmers used some electronic media such as Radio and Television for their recreational purposes not as a learning tool to improve their agricultural technology. Besides, due to their low educational level and purchasing ability, they were less interested to obtain information from the print media (newspaper, magazine, bulletin, leaflet etc.). Out of four institutional factors, farmer field school and extension agent are the two significant factors that helped to ascertain that institutional factors are the most important for IPM adoption. The result is compatible with those of other studies such as conducted by [18] [41] [42] and [43] who found institutional factors to have the biggest impact on agricultural technology adoption. On the other hand, management factors were the least important in adoption of IPM which is consistent with the findings of [15] and [44].

Individual characteristics that were significant covered all five broad categories. According to the level of importance of the independent variables, contribution of spatial factors was lower than those of economic and institutional factors but higher than those of social and management factors. The notable matter is that the spatial factor, which was taken as new dimension in the study, was found as not only important but also the 3rd most important contributor in the adoption of IPM. Hence, the spatial factors should be given emphasize by the policy makers in order to increase the adoption of this ecological sound approach (IPM).

6. Conclusion

Studies on determinants of adoption of IPM during the last three decades explored various social, economic, institutional and management factors as important determinants. This study analyzed spatial factors, besides others, to identify the important factors for vegetable farmers adoption of IPM by taking the issue of adoption behavior is complex and related with assorted factors. In addition, the study discussed the importance of the factors according to their categories besides individually. Regarding the first issue, it was observed through statistical analysis that farmers' IPM adoption decision was influenced by various spatial, social, economic, institutional and management factors such as FFS training, extension contact, land ownership, perception towards IPM, distance to nearest market, use of improved variety and distance to agriculture office. So, in order to increase the adopters of IPM, DAE should take the initiative to facilitate more FFS training and extension contact for the farmers. Moreover, during the selection session of farmer for training program and for extension contact, emphasize should be given to those who are tenant farmers, who have unfavorable perception towards IPM and use local variety, who live close to the market but far away from agriculture office as these farmers show less interest to adopt IPM. Regarding the second issue, it was discovered that the importance of spatial factors in the adoption of IPM was higher than those of social and management factors but lower than those of economic and institutional factors. Though there were variations among the significant factors regarding their level of contribution, for policy making, all significant factors should be considered in order to improve the adoption rate of IPM. However, in case of fund, time and other limitations focus can be concentrated on the few top most important factors. Many factors are relevant with the technology adoption but only twenty characteristics were selected for investigation in this study. Moreover, the study is conducted in a specific location of Bangladesh. Therefore, study should conduct with considering various factors giving emphasize on spatial items and a different location.

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