



# What is the Level of Satisfaction with Environmental Factors During COVID-19?

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## KEYWORDS

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## ABSTRACT:

**Introduction:** In response to climate change and infectious disease prevention, the importance of the environment and health has increased, as human health and wellbeing has been devastating from the Covid-19 crisis. Satisfaction is a key factor of the quality of life. In order to provide policy priorities combating climate change and Covid-19, providing the satisfaction among environmental factors and key factors affecting the willingness to pay for the environmental health might be crucial.

**Objectives:** The purpose of this study is to identify satisfaction of residents with environmental factors and examine determinants of influencing their willingness to pay for the environment health.

**Methods:** An importance-performance analysis was used to explore the level of satisfaction regarding environmental factors during Covid-19. This is based on a survey data of 332 residents in Chungnam province, South Korea. Logistic regression analysis was implemented to find out the factors influencing the willingness to pay (WTP) for environmental health.

**Results:** The findings revealed that climate change, waste, energy, air, environmental health were key attributes required the highest priority for improvement. Logistic regression analysis examined that satisfaction of environmental health was a main factor associated with the residents' WTP for environmental health.

**Conclusions:** The attributes which are low satisfaction and high perception on the importance are needed to be improved. The outbreak of Covid-19 pandemic might be relevant to decrease in the satisfaction of environmental health. This suggests that the improving the services of environmental health might be important for post-pandemic period. These finding could contribute to improving environmental factors and the sustainability of environmental planning.

## 1. Introduction

Unprecedented Coronavirus outbreak has been devastating impact on human wellbeing and life [1,2]. The importance of the environment and health has increased as Covid-19 crisis lead to have an influence on people' physical and mental health [3, 4].

Satisfaction with environmental factors is a key factor of the quality of life and a psychological factor with daily experiences [5, 6]. Previous researches have considered the level of satisfaction among environmental factors such as air and energy [7-10]. This implied that the satisfaction of residents might vary significantly from spatial and socio-political inequality [11]. In addition, many studies have

investigated the estimated WTP for environmental quality improvement [12-14]. Several studies have provided the concept of climate mitigation policy for achieving sustainability and willingness to pay for climate change mitigation [15-20] associated with energy and air pollution [17, 21]. However, due to increases on the importance of environmental factors and health concerns during Covid-19 outbreak, little is known about the satisfaction of residents among environmental factors, in particular, in Asia and South Korea.

Chungnam Province is one of the eight provinces of South Korea and is so called urban-rural complex areas with a 2012 GDP per capita of \$56,133 (Chungnam



province, 2021). Chungnam Province is divided into 8 cities (si) and 7 counties (gun) which is located in the southwest of the Korean Peninsula. The total area of South Chungcheong Province is 8,247.2 km<sup>2</sup> as of early 2023, accounting for 8.2% of the total area of the country (100,431km<sup>2</sup>). It has excellent ecological natural resources, and internationally important biological habitats such as uninhabited islands, marine ecology near the west coast. The water resource uses the Geumgang River, which is one of the major river in South Korea, following the Han River and Nakdong river. Geumgang River is used as a major source of water for living, industrial, and agricultural purposes in the areas. The water resources is rich in endemic fish species and the water quality varies from upstream and downstream. There are concerns about environmental health damage to residents that have been continuously raised due to coal, steel complexes, asbestos, the residents may be sensitive to environmental health. In addition, the proportion of the population aged 65 or older is 18.6% (as of 2020), which might continue to be higher than the national rate and may increase the social burden due to the increase in the health vulnerable population.

Moreover, during and after COVID-19 pandemic, a lot of researches have emphasized the importance of ecosystem services such as natural ecosystem services and marine ecology [22-25]. A lot of existing studies have shown the determinants of willingness to pay for improved water supply and quality, climate change, air pollution [26-30]. Several studies have investigated association between life satisfaction and environmental health under the impact of pandemic [26-30]. However, few studies have focused on satisfaction with and key attributes among environmental factors during Covid-19 and investigated important factors influencing willingness to pay of the environmental health. Therefore, in order to provide policy priorities combating climate change, it has becoming important to find out the satisfaction with the environmental factors among residents and to find out key attributes related with health and environment.

## 2. Objectives

The purpose of this study is to evaluate key attributes among environmental factors during Covid-19 outbreak as provided the satisfaction and importance level using

an importance- performance- analysis (IPA). Additionally, this aims to provide main determinants influencing the WTP for environmental health using logistic regression with a case study of Chung Nam in South Korea.

## 3. Methods

The total sample size was 332 as a face-to-face survey was implemented in Chungnam province, South Korea. Prior to the main survey, a pilot survey tested to have the clarity of each question of the questionnaire. The questionnaire was classified into three parts. In the first part, series of questions were asked about the level of satisfaction and importance with environmental factors. The questions are asked about the satisfaction with a choice answer on a 5-scale Likert questionnaire. The 10 attributes about environmental factors were air, soil, climate change, waste, energy, environmental health, marine ecology, natural ecosystem, water, noise and vibration were selected. In the second part, this section included the WTP questions for improving environment health. Finally, in the third part of the questionnaire, socio-economic status was included such as age, residential years and household income.

Importance-performance matrix called the Cartesian diagram is shown as a grid which is consisted of four quadrants graphically (see Fig. 1). IPA was implemented to identify the most important factors for environmental health. With values given the satisfaction among environmental factors on the X-axis and the importance on the Y-axis, the curve intersection was shown as the average value in the four quadrants [31]. IPA uses a group of attributes associated with specific services to be evaluated based on the level of satisfaction according to each attribute and how the attributes of environmental factors are perceived.

Logistic regression is a statistical method to examine how dependent variables affect independent variables which are bivariate variables [32]. This is used to measure the relationship between the dependent such as a dichotomous outcome and variable either continuous or categorical variables. Based on the findings of earlier studies, our study hypothesized that socio-economic variables plays an important role on the decision of WTP [33-34]. Age of residents are expected to be an influencing factor as older people are more interested in their environmental health. Income is expected to have



a positive influence on the WTP. This is because higher income is more likely to be affordable to pay. The period of residence is expected to have a positive influence on the decision of WTP. The higher residential period, the higher the probability that residents living longer may have more the WTP. The satisfaction of environmental health is hypothesized to be negatively associated with residents' choice on the WTP due to higher risk of their health.

#### 4. Results and Discussion

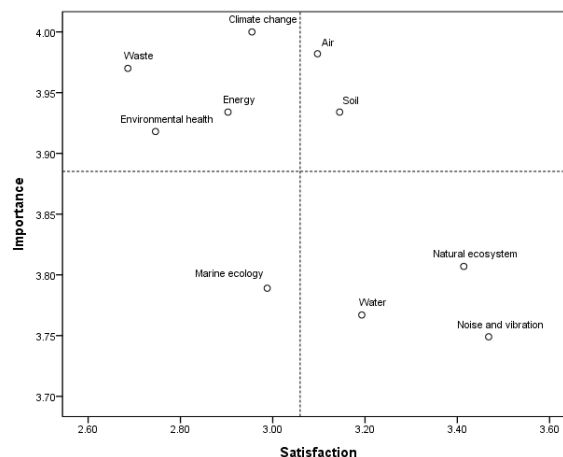
Table 1 shows the mean values of importance and satisfaction level. Among environmental factors, climate change showed the highest importance with 4 points, and air, soil, waste, energy, and environmental health all showed high importance with 3.9 points or more each. On the other hand, in terms of satisfaction, noise vibration and natural ecology showed the highest level of satisfaction with 3.4 points, followed by soil and water satisfaction with 3.1 points. The finding indicates that attributes with low environmental satisfaction were found to have high importance. This might imply that as satisfaction decreases, its importance becomes greater.

**Table 1.** Mean of satisfaction and importance level

Attribute	Importance	Satisfaction
Air	3.982	3.097
Soil	3.934	3.145
Climate change	4.000	2.955
Waste	3.970	2.686
Energy	3.934	2.903
Environmental health	3.918	2.746
Marine ecology	3.789	2.988
Natural ecosystem	3.807	3.414
Water	3.767	3.193
Noise and vibration	3.749	3.468

The IPA is plotted for each attribute in Figure 1. The result of IPA showed that key attributes among environmental factors were climate change, waste,

energy, air, environmental health. For the attributes, improvements are required due to low satisfaction and high importance of residents.



**Figure 1.** The result of IPA

This is in line with the findings implied at residents have importance on climate change, waste, energy, environmental health [19-21]. The quality of the environment is related with the satisfaction of the environmental factors. This is in line with the results imply that a link between the occurrence of new infection and their health. The emergency of Covid-19 pandemic can lead to threatening of the health and environment from climate change and energy use [1, 35-36]. Residents' perceptions about environment and health has been increased from the pandemic [37]. During the pandemic, the attitudes of households towards food consumption was changed as an increased packed food consumption and the use of food delivery services lead to an increase in waste generation, in particular, in South Korea [38-39]. This can give more attention in people to waste management. This can be relevant to the results from the existing studies showing that impact of the outbreaks on food consumption in households at home and eating out [40-41].

The results of socio-economic characteristics show in Table 2. In terms of age, respondents in their 60s or older were the highest at 37.35%, followed by those in their 50s at 28.0% and those in their 40s at 20.48%. With respect to income group, the 21-30 group had the highest income at 23.19%, followed by the 31-41 group at 20.18%. The average number of years of residence



was 38.77. As the surveyed age was higher, the average number of years of residence was somewhat higher.

**Table 2.** Descriptive statistics of characteristics

Variables	Description	Total(N: 332)	
	Category	N	%
Age (years)	20s	13	3.92
	30s	34	10.24
	40s	68	20.48
	50s	93	28.0
	> 60s	124	37.35
Income <sup>a</sup> (million KRW)	< 10	34	10.24
	10-20	57	17.17
	21-30	77	23.19
	31-40	67	20.18
	41-50	57	17.17
	> 51	40	12.05
Variables	Mean	Std. dev.	
Residence years	38.77	18.67	

<sup>a</sup> Unit US\$ 1.00 = KRW 1,334 (2024.2).

In addition, Table 3 provides the logistic regression model for WTP for environmental health. The results showed that the variable satisfaction of environmental health was found to be a key factor influencing the WTP for the environment health.

**Table 3.** Logistic regression model for the WTP of environment

Variables	Coef.	Std.Err.
Satisfaction of environmental health	-0.327***	0.137
Age	0.028	0.131

Income	-0.070	0.100
Residential years	-0.047	0.225
constant	0.748	0.839

*Number of obs.* = 332; *LR chi2(4)* = 7.34;

*Prob > chi<sup>2</sup>* = 0.12; *Log likelihood* = -222.67539;

*Pseudo R<sup>2</sup>* = 0.0162

In the logistic regression analysis, our finding was inconsistent with the existing studies on WTP estimation showing the socio-economic variables were key factors. There. Our result in conformity with previous research investigating the satisfaction can potentially affect the decision on the WTP [42-43] and might be an association with the emergence of COVID-19 [44-45].

## 5. Summary and Conclusion

The aim of this study is to identify satisfaction of residents with environmental factors and examine determinants influencing their willingness to pay for the environment health using a case study of Chungnam Province in South Korea. The result of IPA regarding the key priority including 10 environmental attributes showed that the key attributes which have low satisfaction and high perception on the importance were the environment associated with climate change, waste, energy, air, environmental health. In the logistic regression analysis, the results showed that the variable satisfaction of environmental health was found to be a key factor influencing the WTP for social cost of the environment health. Our finding was inconsistent with the existing studies on WTP estimation showing the socio-economic variables were key factors.

Our analysis shows key findings. First, less performance attributes indicates climate change, waste, energy, air, environmental health. The 5 attributes which are low satisfaction and high perception on the importance are needed to be improved. Second, as environmental factors can affect interactive effects on the occurrence of COVID-19, the pandemic has affected an increase in residents' awareness about their environment and COVID-19 incidence can be relevant to decrease in the satisfaction of environmental health. This suggests that the improving the services of environmental health might be important to increase the satisfaction of residents.



Despite the practical implications, this study has some limitations. First, the scope of this study and targeted population are within ChungNam province, South Korea. Second, this cross-sectional survey data can not understand causal effects between variables. Third, residents during Covid-19 might be health risk-taking. This can lead to the differences of satisfaction with environmental factors during and after pandemic.

Future research needs to extend study areas across several geographical regions and compare the findings of this research before and after the pandemic. Further studies could be explained using previous perspectives reflecting pro-environmental behaviours after the outbreaks. In addition, future studies could be relevant to policy response beyond heuristic hypotheses in the post-pandemic. Future investigations can be suggested that the findings showing how Covid-19 has reshaped the life of rural residents in developed and developing countries and differences with various conditions of public infrastructures and services during the Covid-19 pandemic in rural areas. This study could provide basic information to help policy decision in post-pandemic environment and in the pursuit of sustainability.

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