

1 Article

2 A Study on the Determinants of Eco-Innovation of 3 Korean Manufacturing Firms

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11 **Abstract:** The move to a low carbon economy is very important for enhancing international
12 competitiveness. The eco-innovation is the critical factor of the green paradigm. This study is
13 designed to investigate deeply the determinants of eco-innovation of manufacturing firms in Korea
14 by suggesting anticipated regulations, self-regulations, and industry-specific characteristics as
15 external factors and open information sources as internal factors. The data used in the analysis is
16 1,946 sample firms from Korean Innovation Survey 2010 based on the Oslo Manual. Using the multi-
17 variate probit analysis and the zero-inflated negative binomial (ZINB) regression analysis, we have
18 found out that the anticipated regulations and self-regulations have significant influences both on
19 eco-process innovation and eco-product innovation, while industrial characteristics have no effects.
20 The empirical results also show that the breadth of information sources has a positive effect on
21 businesses in implementing eco-innovations. Our findings show that the Korean government should
22 provide a good platform where firms can better understand the future trends of environmental
23 policies, particularly policies on anticipated and self-regulations. At the same time, Korean firms
24 should establish a voluntary system to control environmental activities so that they can improve eco-
25 innovations through integrating external information.

26 **Keywords:** eco-innovation; anticipated regulation; self-regulation; industry-specific characteristics;
27 information sourcing openness; multivariate probit model; zero inflated negative binomial model

28 1. Introduction

29 As the Paris Convention concludes, greenhouse gas reductions are becoming a global obligation,
30 and eco-innovation pressures are increasing for firms. Since securing low-carbon capabilities of firms
31 is a very important factor in strengthening international competitiveness, governments in each
32 country are encouraging firms' eco-innovation through not only regulation but also support [1]. The
33 transition to a low-carbon economy is a big challenge for highly carbon-dependent manufacturing
34 companies. Large-scale investment is needed in new facilities and technology development, and it is
35 difficult to create competitive advantage with existing technologies, production methods and
36 products due to changes in consumer awareness and preference [2]. Many studies have been
37 conducted on the factors that determine the eco-innovation of firms.

38 Previous studies on the determinants of eco-innovation have been limited in geographically and
39 scholarly concerns. From the geographical point of view, much of the research is focused largely on
40 the developed countries such as Germany [3], Britain [4], Spain [5], and overall European countries
41 [6]. Asian countries, such as China [7] and Taiwan [8], have recently been studied, but there is little
42 research conducted on Korea.

43 From the scholarly concerns, firm size, industry characteristics, and market pressure are typical
44 and most discussed determinants of eco-innovation. However, in order to more efficiently estimate
45 the factors that determine the eco-innovation of firms, it is necessary to consider self-regulation
46 activities, industry-specific factors, anticipated-regulations, and information sourcing openness.

47 Information sourcing openness is newly suggested for eco-innovation. This is related to open
48 innovation framework [9] and sheds new light on that firm's effort for open information encourages
49 eco-innovation and consequently it endows the competitiveness of a firm. Although some of the
50 mentioned determinants have been suggested by a few studies [3], they lack an explanation of logic
51 and causation for eco-innovation activities of firms.

52 The purpose of this study is to identify the determinants of eco-innovations of Korean
53 manufacturing firms. Compared to previous research, we concentrate more on the factors that have
54 not been scrupulously treated before. Anticipated-regulations, self-regulations, and industry-specific
55 characteristics are introduced as external determinants, and information sourcing openness is
56 introduced as an internal determinant with logic and causation derived from various theories. These
57 variables, together with regulatory pull/push and market pull, also play an important role in
58 determining eco-innovation activities of a firm. More importantly, if the determinants proved to be
59 powerful driving forces of eco-innovation, then it contributes to fill the research gap between general
60 innovation and eco-innovation. Besides, Korean manufacturing firms' characteristics can be shown
61 and compare our results with those of previous research done in other countries.

62 The remainder of the paper is organized as follows: Section 2 reviews the relevant literature and
63 the hypotheses are proposed. Section 3 the research model and estimation method is presented.
64 Section 4 illustrates the empirical and measurement results. Section 5 provides the conclusions and
65 implications and the future research direction.

66 2. Literature review and Hypotheses

67 2.1 Concepts of Eco-innovation

68 Eco-innovation is not limited to innovations in products, processes, marketing methods, and
69 organizational methods, but also includes innovations in social and institutional structures [10]. Most
70 of researches, however, focus on products and processes related innovation activities of firms and
71 are so in eco-innovation researches. According to Negny et al. [11], eco-process innovation is defined
72 as a newly-introduced elements on the production process of eco-friendly products. And eco-product
73 innovation is defined as an introduction of new or ground-breaking eco-friendly products. These two
74 types of eco-innovations will be treated as dependent variables in representing eco-innovation
75 outcomes. Eco-process innovation is measured in terms of consumed material per output unit in the
76 process, emitted carbon-dioxide, contaminated material, reduction of harmful and wasted material
77 and water, and recycle of material. Eco-product innovation is measured in terms of energy
78 consumption reduction from using concerned products, reduction of water and air pollutants, and
79 improvement of recyclability after use. In the research eco-process and product innovations are
80 separately discussed and measured on Korean manufacturing firms.

81 2.2 Determinants of eco-innovation and its effect on performance

82 Scholars discussed about the determinants of eco-innovation in various ways. Horbach [12]
83 grouped them into supply, demand, and environmental policy, and Horbach et al. [3] grouped into
84 regulation (Pull/Push), market factors (Pull), technological factors (Push), and firm-specific factors.
85 Cai and Zhou [7] divided the determinants into internal drivers such as technological capability,
86 organizational capability, and CSR, and external drivers such as regulation, customers, and
87 competition, and took integrating capability as a mediating variable and then analyzed the
88 relationship with eco-innovation. Following Cai and Zhou [7], in our study, external and internal
89 factors are analyzed. The external factors include anticipated regulations, self-regulations, industry-
90 specific factors and other control variables. In dealing with internal factors, the focus is placed on
91 external information openness, and other factors (technology, organizational capability, etc.) are used
92 as control variables.

93 Contingency theory explains the mechanism of the influence of outer circumstances on firm's
94 internal organization activities and decision making. It seems adequate for explaining the influence
95 of anticipated regulation, self-regulation, and industry-specific factors on eco-innovation
96 performance. One of the issues we are interested in is whether the regulation, including anticipated
97 and self, has some influence on corporate eco-innovation activity. From the view point of contingency
98 theory, anticipated- and self-regulation is outside circumstances which have direct effect on firm
99 activity. Traditionally scholars insisted that regulations have negative influence on corporate
100 innovation activities and its performance [13]. Contrary to this view, Porter and van der Linde [14]
101 argued that companies would carry out more innovations to prevent environmental pollution under
102 stricter future regulations. Industry specific factors also are external environment that has direct
103 influence on firm activities. In this paper, we focus on energy consumption of an industry which
104 consequently incurs more regulation of the industry.

105 2.2.1 External determinants of eco-innovation

106 **Anticipated regulation**

107 Preemptive responses for anticipated regulations can save costs that are possibly incurred in the
108 future, by applying the technologies related to the anticipated future regulations in advance to their
109 production processes and products [15]. The firms that succeeded in innovation beforehand can
110 prevent their current or potential competitors from easily entering the market by utilizing their own
111 competitive superiority, for example, by setting the environmental regulation standards in the
112 industry [16]. Although there still exist organizational coordination problems [17], a company will
113 collect information about the anticipated regulations and take strategic actions if it is aware of these
114 advantages.

115 Recent empirical results have proved that anticipated regulations spur eco-innovation [3,18].
116 The path of its impact can be explained by two ways. One is firm's recognition path. If a firm
117 anticipates that there will be new regulations in the future and recognizes them as threat, it will take
118 various actions in response to the regulations. They can reset its strategic direction and make new
119 frames according to new conditions [19]. The second path is from learning effect of late-movers. The
120 first-movers' response to the regulation can encourage late-movers' participation in eco-innovation
121 activities. Under some circumstances late-movers can respond more actively than first-movers [20].
122 Through these two paths the anticipated regulation can accelerate the eco-innovation activities.
123 Furthermore, first-movers' response to the regulation will encourage late-movers' participation, so
124 late-movers can respond more actively than first-movers [20].

125 The Korean government has introduced various ways such as public hearing or prior notice
126 system to help companies adapt to new regulations. As a member of the Paris Convention in 2016,
127 Korea has an obligation to largely reduce its CO2 emissions. Under these circumstances, firms make
128 endeavors to come up with sustainable and active measures to respond to anticipated regulations.
129 Based on the discussion above, we propose the following hypothesis.

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131 H1. The anticipated regulations will positively affect Korean firms' eco-innovation performance.

132 133 **Self-regulations**

134 Another external factor that influences eco-innovation is self-regulations within industry.
135 Regulations are generally imposed by the government. On the contrary, the stakeholders, as
136 themselves are the object of regulation, regulate their own activities and advancing information
137 technologies also encourage self-regulation. Advanced information technologies, however, also
138 encourage self-regulation, leading stakeholders to autonomously control their practices. Self-
139 regulation includes establishing financial exchanges, licensing professionals, setting safety standards,
140 controlling entertainment content, advertising restrictions, and voluntarily reducing pollution, etc.
141 [21], which will continuously change along with the development of technology and society.

142 Self-regulations are formed under the following conditions – 1) when there is market failure, 2)
143 when it is hard to adjust the market failure or the failure accompanies huge costs, and 3) when self-
144 regulations are more efficient than public (governmental) regulations [22,23]. Among these
145 conditions, the third one is relevant to benefit-costs and differences between public regulations and
146 self-regulations. Ogus [23] explains that self-regulation is advantageous from the following
147 perspectives: First, self-regulation agencies have many experts and experiences of technological
148 innovation trials in certain areas. They can also establish standards with less information costs, so
149 firms under self-regulation have greater innovation potential; Secondly, companies can reduce costs
150 in monitoring and enforcement through creating reliability among stakeholders. Lastly, relatively
151 less formal nature of self-regulation enables lower costs for enforcement and standard revision.

152 Self-regulation has both positive and negative effects. From the legislative view, self-regulation
153 is a type of contemporary ‘corporatism’ which is empowered not by the formal institutional process,
154 but by the informal interest groups. Such groups have the potential to abuse the power or tendency
155 to administer not in right way. Potential abuse/misuse of the power, in virtual, is activated when the
156 third parties experience with negative effect [22]. Furthermore, self-regulation related groups are
157 tend to be very generous to illegal actions of the group members [24]. Rent-seeking hypothesis
158 explains that the establishment of self-regulation agency, by itself, hinders or making barriers in
159 voluntary establishment of self-regulate organizations. Since established self-regulation agency feels
160 that it owns vested rights in this field and does not want to share the rights with other interest groups.
161 This situation itself creates the inefficiency.

162 This gives important implications to both the government and firms. If it is more efficient for
163 firms to do voluntary environmental regulations, there is no reason for the government to set rules
164 on the industry while incurring social costs. Self-regulation is also beneficial because unintended
165 negative effects caused by government regulations will not be a problem anymore. Voluntary
166 regulation also enables firms to reduce burden from forceful government regulations, boost
167 environmental competitiveness, and appeal to the market more effectively with their
168 environmentally responsible behaviors [25].

169 It can be expected that firms can benefit from self-regulation thanks to regulatory flexibility,
170 preemption of existing regulations, and improved anticipation of future regulations. Firms are also
171 expected to actively engage in eco-innovation and achieve better performance. In Korea, corporate
172 social responsibility (CSR) is regarded very important for firms, and eco-friendly corporate image is
173 a valuable asset for corporate performance. Based on the discussion so far, the following hypothesis
174 can be established:

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176 H2. Self-regulations will positively affect Korean firms’ eco-innovation performance.

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178 **Industry-specific factors**

179 Most eco-innovation related research empirically analyzed the determinants of eco-innovation
180 activities of firms [6]. However, few studies considered industry-specific characteristics, which can
181 also influence eco-innovation activities. According to Horbach [12], high energy-consuming
182 industries, such as automobile and machinery, show a positive relationship with eco-innovation, but
183 industries which consume less amounts of energy do not show any significant relationship. Machiba
184 [26] chooses three sectors such as the automotive and transport industry, the iron and steel industry,
185 and the electronics industry as examples and analyze the application of eco-innovation. And the
186 result indicates that eco-innovations in these industries are more active because energy-intensive
187 industries are more likely to pursue eco-innovation to increase energy efficiency.

188 Regarding industry-specific factors, few studies regarded these factors as the determinants of
189 eco-innovation. Most Korean studies about the relationship between industry-specific factors and
190 eco-innovation assert that there is a positive relationship between them. When treating climate
191 change issues, energy consumption of an industry is most widely used as a proxy for industry-

192 specific factors. In this paper, we expect that energy consumption of an industry has a positive
193 relationship with eco-innovation activities of Korean manufacturing firms.

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195 H3. Energy consumption as an industry-specific factor will positively affect Korean firms' eco-
196 innovation performance.

197 2.2.2 Internal determinants of eco-innovation

198 **Information sourcing openness for eco-innovation**

199 Chesbrough [9] argued that innovation outcomes can improve through greater openness to
200 obtaining and using external information. When a firm becomes more open to the use of external
201 information, it can achieve eco-innovation and higher performance. Firms should not only become
202 more open to external information, but also consider the importance of such information. Companies
203 with more sources of gathering helpful and important information can have more opportunities to
204 achieve higher performance. De Marchi and Grandinetti [27] argued that the information obtained
205 from external partners such as research institutions, colleges, or competitor firms is more important
206 to eco-innovation than to other types of innovations.

207 Laursen and Salter [28] categorized external information collected for innovation activities in
208 terms of breadth and depth. For the breadth of sourcing, Ghisetti et al. [29] suggested two reasons
209 why firms need a broader source of external information. Firstly, it is difficult to respond to various
210 changes only with their own internal resources and capabilities, especially under the global climate
211 change situation. Secondly, eco-innovation requires a huge volume of information in achieving
212 multiple objects, not only improving the productivity and quality of common innovation but also
213 reaching environmental targets. Rennings and Rammer [30] proved that the German firms use
214 relatively more diverse sources of information to obtain innovative outcomes, and Horbach et al. [31]
215 argued that eco-innovation needs more external information sources.

216 Meanwhile, firms need more professional and in-depth information guides in order to carry out
217 innovative activities. In this study, we use the importance of information, instead of using the concept
218 of depth. It seems that importance is similar to depth in that it is understood as usefulness and
219 sincerity of outsourced information. However, the importance evaluates the importance level of
220 external information to the firm, while the depth of information evaluates the degree of specialty and
221 cooperation of partner companies. Resource-based view (hereinafter referred to as RBV) insists that
222 the way a firm keeps its competitive advantage depends on the uniqueness, rarity, and worthiness of
223 its resources, and on whether it is difficult to imitate its resources or not [32]. Capabilities based on
224 accumulated information can be one of the key resources that cannot be easily imitated by
225 competitors. The complexity and rapid changes of the recent external circumstances urge firms to
226 gather important information from outside as well as inside the organization [9].

227 It is expected that a company will be more likely to achieve innovation, including eco-
228 innovation, when it acquires greater amount of important information from various external sources.
229 Korean firms are making efforts to strengthen their competitiveness by introducing information from
230 various external sources. In a study on the effects of external information search on the Korean ICT
231 sector, Hwang and Lee [33] found that external information search is relevant to incremental
232 innovation and productivity. From the point of supply chain management, Woo et al. [34]
233 investigated communication capability and external green integration for the financial and green
234 performance of construction providers in Korea. Their results show that the greater capability a firm
235 shows in sharing information with other organizations, the more likely it is for the firm to acquire
236 superior positions in taking environmentally cooperative actions, in making green cost reduction,
237 and in securing higher competitiveness. It means that the efforts to get valuable information from
238 external organizations can lead to better performance of Korean manufacturing firms. According to
239 these discussions, the following hypotheses are proposed.

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241 H4. Information sourcing openness have a positive influence on eco-innovation performance of
242 Korean manufacturing firms.

243 H4a. When information sourcing becomes broader, the performances of eco-innovation by
244 Korean manufacturing firms increase.

245 H4b. When information sourcing is more important to receiving firms, the performances of eco-
246 innovation by Korean firms increase.

247 2.2.3. Control variables

248 This study sets the control variables as follows. The control variables as external factors are
249 market pull, regulatory pull and push. Following the demand pull hypothesis, the market demands
250 or needs promote technological innovations [35,36]. Firms prefer to take competitive advantages
251 through eco-innovation as they are aware of the market demands for eco-friendly goods triggered by
252 the need for energy saving and environmental preservation [18,37-39]. Regulatory push and pull are
253 also important influential factors for eco-innovation. There is a conventional view that governmental
254 mandatory regulations (regulatory push) hamper economic growth by aggravating cost loads [13,40-
255 42]. On this account, firms try to avoid cost increase and reduce innovative actions which require
256 capital expenditure. Conversely, there are also cases where the government's environmental
257 regulation is an important factor in driving firms to pursue eco-innovation [3,43]. Stricter regulations
258 drive firms to lead innovations to reduce environmental pollutants, which enable profits to exceed
259 costs [14]. On the other hand, Governmental supporting policies (regulation pull factor) have a
260 positive influence on firms' eco-innovation [12,44,45].

261 The control variables as internal factors are innovative capability, technology push, firm size and
262 age. Eco-innovation requires more professional knowledge compared to general innovation [46,47].
263 It means that general innovation capability is necessary in successfully accomplishing eco-
264 innovation. General innovation capability includes technological innovation capability for products
265 and processes and non-technological innovative capability for markets and organizations. Generally,
266 higher general innovation capability leads to higher outcomes of eco-innovation. Technology push
267 like R&D investment is also important determinants for eco-innovation. Firms' investments into R&D
268 produce new technological information and promote technological innovation by strengthening
269 internal capability of assimilation and exploitation [48]. R&D investment refers to technological and
270 absorbing capabilities, a determinant of internal technological level of a firm [49]. It is also true for
271 eco-innovation [12].

272 3. Research Model and Data

273 3.1 Research Model

274 The research model of this study is presented in <Figure 1>. The dependent variables are divided
275 into eco-process innovation and eco-product innovation. Eco-process innovation consists of six items
276 and eco-product innovation consists of three items. Whether eco-innovation is executed or not is
277 analyzed by using the binary dependent variables, and the sum of all areas, from 0 to 9, is used as the
278 aggregated variable for eco-innovation performance.
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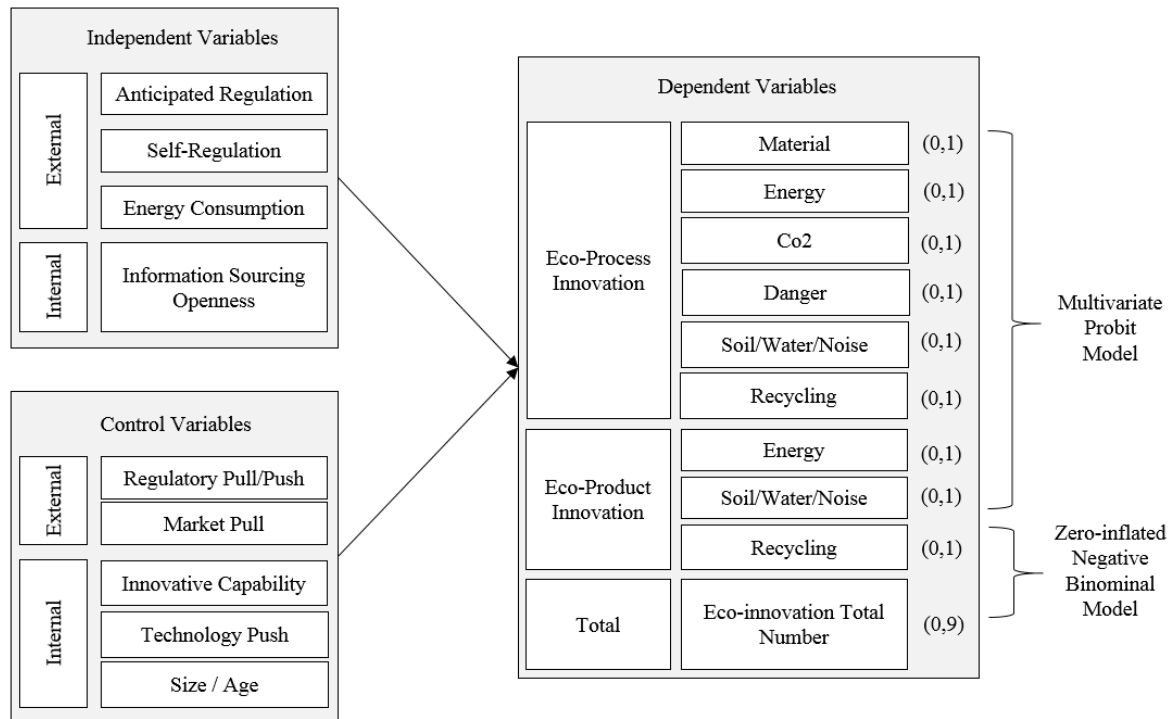


Figure 1. Research Model

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281282
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284285 *3.2 Definition of the data and the variables*

286 The data used in this study is "Korean Innovation Survey 2010: Manufacturing sector." The
 287 statistics come from Science and Technology Policy Institute (STEPI)'s investigation into firms'
 288 innovation activities from 2007-2009 based on the Oslo Manual developed by OECD and Eurostat
 289 Community Innovation Survey (CIS). The survey is approved by Statistics Korea (KOSTAT) and
 290 recognized to have high reliability, validity, and international comparability. The size of the
 291 population is 41,485, and the samples of 3,925 firms were selected by using the stratified sampling
 292 method, and 1,964 firms remained after the deletion of missing data. The definitions of the variables
 293 are summarized in <Table 1>.

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Table 1. Definition of Variables

Variables		Label	Definition	Type
Independent variables	Anti-Regulation	Anti-Regu	The future predicted environmental regulations or taxes	Binary
	Self-regulation	Self-Regu	Voluntary conventions or agreements within the industry	Binary
	Energy Consumption	Eng-Cons	Within an industry, the averaged energy consumption of the belonged firms	Log
	Information Sourcing Openness	Breadth	The number of used information sources	0~12
		Importance	Averaged degree of information use(=sum of importance of used information/the number of used sources)	0~5
Control variables	Regulatory Pull/Push	Pre-Regu	Existing environmental regulations or taxes	Binary
		Subsidy	Using subsidiaries from the government or financial benefits related to eco-innovation	Binary
	Market Pull	Mkt-Pull	Market demands for eco-innovation from the current or future consumers	Binary
	Innovation Capability	Inno-Capa	The number of innovations on products, processes, organizations, and marketing	0~4
	Technology Push	In-R&D	% of internal R&D expense to sales volumes 2007~2009	Log
		Ex-R&D	% of external R&D expense to sales volumes 2007~2009	Log
	Size		Log (The number of full-time employees in 2007)	Log
Age		The age of the firm (=2014-the founded year)	count	
Dependent	Eco-Process Innovation	D1	Reduction of material consumption per output unit	Binary
		D2	Reduction of energy consumption per output unit	Binary
		D3	Reduction of CO2 emissions	Binary
		D4	Replacing polluting or harm matters	Binary
		D5	Reduction of soil, water, noise, and air pollutants	Binary
		D6	Recycling wastes, water, and materials	Binary
	Eco-Product Innovation	D7	Reduction of energy consumption	Binary
		D8	Reduction of soil, water, noise, and air pollutants	Binary
		D9	Improving recyclability after product use	Binary
	Total Number	D10	(1)+(2)+(3)+(4)+(5)+(6)+(7)+(8)+(9)	0~9

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311 *3.3 Analysis Model*

312 As mentioned before, there are two special kinds of dependent variables in our research model.
313 One is binary (0, 1) variable, and another is count variable. The former is on whether a firm engages
314 in eco-innovative actions, including six eco-process innovative actions and three eco-product
315 innovative actions. The latter is the overall number (count number) of the innovative actions.

316 Considering the special data types, we estimate multivariate probit models addressing the nine
317 innovative actions at the same time. In our research, the dependent variables will be 0 if the firm does
318 not engage in eco-innovative action, and will be 1 if the firm engages in eco-innovative action. And
319 the multivariate probit model is a generalization of the probit model used to estimate several
320 correlated binary outcomes jointly. In this research, the multivariate probit model allows a
321 simultaneous estimation of the nine types of eco-innovation. The existing evidence about the
322 likelihood of complementarities between different types of innovative activity makes us consider that
323 unobserved firms' characteristics may jointly influence the nine types of eco-innovation [50]. If these
324 correlations were neglected, parameter estimates would be biased and inconsistent. The multivariate
325 probit models can be written as:
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$$y_{im}^* = \beta_{imo} + \beta_{im1}x_1 + \beta_{im2}x_2 + \dots + \beta_{imp}x_p + \varepsilon_{im}$$

$$y_{im} = 1 \text{ if } y_{im}^* > 0 \text{ and } 0 \text{ otherwise.}$$

Where i represents individual firms; y_{im} are nine binary eco-innovation dependent variables ($m= 1, 2, \dots, 9$); x_p are independent variables and control variables ($p= 1, 2, \dots, 12$); and ε_{im} are error terms distributed as multivariate normal, each with a mean of zero, and variance-covariance matrix V , where V has values of 1 on the leading diagonal and correlations $\rho_{jk} = \rho_{kj}$ as off-diagonal elements. Also, we estimate the zero-inflated negative binomial regression model for the overall number of eco-innovation activities. There are two basic methods for modeling count variables with excessive zeros, zero-inflated poisson (ZIP) regression and ZINB regression. There is an issue that should be considered when using Poisson models which are a Poisson distribution and constrain the variance to be equal to the sample mean. This is a problem in our case given that the sample is much skewed. In contrast, ZIP does not have this constraint. By testing, we ultimately estimate zero-inflated negative binomial models in recognition of the high number of "zero" responses in the dependent variables. According to Table 2, the ZINB is preferred over ZIP. Thus, ZINB models are used to estimate the determinants of the total number of eco-innovations.

Table 2. Tests and Fit Statistics

ZIP	BIC= -7962.343	AIC= 3.425	Prefer	Over	Evidence
vs. ZINB	BIC= -8053.391	dif= 91.048	ZINB	ZIP	Very strong p=0.000
	AIC= 3.375	dif= 0.050	ZINB	ZIP	
	LRX2= 98.622	prob= 0.000	ZINB	ZIP	

The ZINB regression model assumes that there are two distinct data generation processes. The results of a Bernoulli trial are used to determine which of the two processes. For observation i , with probability π_i , the only possible response of the first process is zero counts, and with the probability of $(1 - \pi_i)$, the response of the second process is governed by a negative binomial with mean μ_i . The zero counts are generated from both the first and second processes, where a probability is estimated for whether zero counts are from the first or the second process. The overall probability of zero counts is the combined probability of zeros from the two processes. A ZINB model for response Y_i can be written as:

$$\begin{cases} P(Y_i = 0) = \pi_i + (1 - \pi_i) \cdot \left(\frac{k}{\mu_i + k}\right)^k \\ P(Y_i = n) = (1 - \pi_i) \cdot \frac{\Gamma(Y_i + k)}{\Gamma(k)\Gamma(Y_i + 1)} \cdot \left(\frac{k}{\mu_i + k}\right)^k \cdot \left(1 - \frac{k}{\mu_i + k}\right)^{Y_i} \end{cases}$$

Where k is the over dispersion parameter; Γ is the gamma distribution, and n is a natural number larger than 0. We can model π_i and μ_i as a function of a set of explanatory variables. For π_i , it is common to use a logistic regression with a logit link function, as it describes a binomial process:

$$\text{logit}(\pi_i) = e^{\alpha + \beta_1 X_1 + \beta_2 X_2 + \dots + \beta_n X_n}$$

Where α is the intercept, $\beta_1 \dots \beta_n$ are the model parameters to estimate, and $X_1 \dots X_n$ are a set of independent variables. We can also model the dependence of μ_i on a different (or same) set of explanatory variables with the aid of a log link function:

$$\log(\mu_i) = \lambda + \delta_1 Z_1 + \delta_2 Z_2 + \dots + \delta_n Z_n$$

368 Where λ is the intercept, $\delta_1 \dots \delta_n$ are the model parameters to estimate, and $z_1 \dots z_n$ are a
369 set of independent variables.

370 4. Results of the Empirical Analyses

371 <Table 3> shows the results of multivariate probit models, which analyzed the effects of
372 determinate factors on the nine types of eco-innovation of the 1,964 manufacturing firms in Korea.
373 The corresponding Wald tests analyzing the explanatory power of the entire model indicate that the
374 null hypothesis that all parameters of the explanatory variables are zero can be clearly rejected at all
375 common levels of significance for all probit models. The last column in the <table 3> reports the
376 determinants on the extent to which firms engage in eco-innovation which can be seen as outcome of
377 eco-innovation.

378 4.1. The Results of Empirical Analyses of external factors

379 Among the external factors, the future anticipated regulations have positive influences on eco-
380 process and eco-product innovation at the 1% significant level. Also for the eco-innovation outcome
381 performance by how many kinds of innovation activities are enacted, there is a significant positive
382 influence. Therefore, the hypothesis 1 is supported. This result shows that firms make efforts to win
383 competitive superiority by differentiating their products and cutting down expenses by
384 implementing environment-related innovation activities preemptively in response to the future
385 predicted regulations [15, 16]. It means that the argument by Porter and Van der Linder [14] can also
386 apply to Korea. Also in Khanna et al. [46], current and anticipated regulatory pressures, as proxied
387 by penalties, inspections, hazardous air pollutants and non-attainment have a statistically positive
388 impact on an adoption of a new pollution prevention measure. But, due to data limitation, it is
389 difficult to figure out whether companies regard future predicted regulations as an opportunity or a
390 threat.

391 Not only the governmental regulations, but also firms' voluntarily engaged conventions (self-
392 regulation) have influence on their eco-innovation activities. According to the results of analyses,
393 firms which are voluntarily engaged in conventions show higher possibilities of innovation in all
394 activities which belong to eco-process and eco-product innovations. Such firms also have higher
395 numbers of eco-innovation activities than others. From this result, hypothesis 2 is adopted. It means
396 that, as in the argument of Nash and Ehrenfeld [51], eco-innovation activities are also realized under
397 non-public control in Korea, and that voluntarily engaging firms are more likely to use eco-
398 innovation than non-voluntary firms. Despite the vulnerability of voluntary conventions being
399 loosely operated compared to the government regulations without explicit punishment on free-ride
400 or opportunistic behaviors, voluntary conventions promote eco-innovations of Korean firms.

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416 Table 3. Determinants of Eco-innovation by different environmental types & Total Number of Eco-innovation

Number of obs = 1946 Wald chi2 (117) = 2125.87 Prob > chi2 = 0.000 Log likelihood = - 6014.5327			Eco-Process Innovation					
			D1 Material	D2 Energy	D3 CO2	D4 Danger	D5 Soil/Water/ Noise	D6 Recycling
Independent variables	External	Anti-Regu	0.7583*** (9.44)	0.9308*** (11.73)	0.8141*** (10.17)	0.9138*** (11.43)	0.7982*** (10.20)	0.7374*** (9.22)
		Self-Regu	0.7230*** (8.39)	0.8251*** (9.83)	0.8399*** (9.81)	0.6958*** (8.02)	0.7872*** (9.19)	0.9280*** (10.85)
		Eng-Cons	0.0188 (0.88)	0.0363* (1.73)	0.0549** (2.57)	0.0029 (0.14)	0.0543*** (2.63)	0.0750*** (3.66)
	Internal	Breadth	0.0287** (2.30)	0.0232* (1.92)	0.0181 (1.45)	0.0129 (1.06)	0.0198 (1.64)	-0.0068 (-0.58)
		Importance	0.0880* (1.68)	0.0653 (1.28)	0.0272 (0.52)	0.0380 (0.75)	-0.0312 (-0.62)	-0.0020 (-0.04)
Control variables	External	Pre-Regu	0.6855*** (7.69)	0.6268*** (7.18)	0.6615*** (7.48)	1.0226*** (11.51)	1.0763*** (12.51)	1.0579*** (12.04)
		Subsidy	0.7103*** (5.30)	0.6787*** (5.20)	0.6907*** (5.08)	0.7343*** (5.18)	0.7590*** (5.59)	0.8178*** (5.78)
		Mkt-Pull	1.1900*** (15.82)	1.1461*** (15.63)	1.0380*** (13.72)	1.0793*** (14.57)	1.0554*** (14.23)	1.1152*** (15.44)
	Internal	Inno-Capa	0.1523*** (3.91)	0.0908** (2.43)	0.0973** (2.51)	0.2085*** (5.48)	0.0968** (2.58)	0.1287*** (3.50)
		In-R&D	-0.1199 (-1.04)	-0.0023 (-0.02)	-0.0554 (-0.49)	-0.1452 (-1.23)	-0.1497 (-1.32)	-0.3538*** (-2.95)
		Ex-R&D	0.1294 (0.43)	0.0309 (0.11)	-0.0637 (-0.20)	0.3998 (1.28)	0.0138 (0.05)	0.1461 (0.50)
		Size	0.0405 (1.21)	0.0198 (0.61)	0.1088*** (3.30)	0.0225 (0.68)	-0.0016 (-0.05)	0.0087 (0.27)
		Age	0.0005 (0.16)	0.0068** (2.37)	-0.0019 (-0.63)	0.0027 (0.91)	0.0085*** (2.97)	0.0021 (0.75)
		_cons	-2.7555*** (-3.94)	-2.4701*** (-3.66)	-2.9788*** (-4.04)	-1.9467*** (-2.73)	-2.5577*** (-3.72)	-2.2967*** (0.6741)

417 Note. Standard deviation in parenthesis. * p < 0.10; **p < 0.05; ***p < 0.01.

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Table 3. Determinants of Eco-innovation by different environmental types & Total Number of Eco-innovation (continued)

		Eco-Product Innovation			Total Number Negative Binomial Regression Part (>0 eco-innovation)	
		D7 Energy	D8 Soil/Water /Noise	D9 Recycling	Number of obs = 1946 Nonzero obs = 1081 Zero obs = 865 LR chi2 (13) = 946.36 Prob > chi2 = 0.000 Inflation model = logit Log likelihood = -3361.498	
		Number of obs = 1946 Wald chi2 (117) = 2125.87 Prob > chi2 = 0.000 Log likelihood = -6014.5327				
Independent variables	External	Anti-Regu	0.5214*** (6.52)	0.645*** (8.40)	0.5274*** (6.75)	0.8968*** (14.14)
		Self-Regu	0.8705*** (10.34)	0.7181*** (8.53)	0.7931*** (9.70)	0.9503*** (13.60)
		Eng-Cons	-0.0029 (-0.14)	0.0270 (1.30)	-0.0119 (-0.58)	0.0320** (2.04)
	Internal	Breadth	0.0213* (1.80)	0.0245** (1.97)	0.0313*** (2.62)	0.0212** (2.35)
		Importance	-0.0522 (-1.06)	0.0543 (1.06)	0.0168 (0.34)	0.0291 (0.78)
Control variables	External	Pre-Regu	0.6239*** (7.22)	0.7478*** (8.54)	0.7016*** (8.17)	1.0457*** (14.61)
		Subsidy	0.7125*** (5.13)	0.6853*** (5.06)	0.4359*** (3.23)	0.8006*** (7.47)
		Mkt-Pull	1.2471*** (17.39)	1.1636*** (15.43)	1.0428*** (14.63)	1.3937*** (23.52)
	Internal	Inno-Capa	0.1468*** (4.00)	0.1404*** (3.63)	0.1164*** (3.18)	0.1611*** (5.67)
		In-R&D	-0.1359 (-1.21)	-0.1329 (-1.10)	-0.3950*** (-3.14)	-0.2145** (-2.43)
		Ex-R&D	0.1907 (0.65)	0.4419 (1.51)	-0.3264 (-1.00)	0.1140 (0.49)
		Size	0.0629* (1.94)	0.0450 (0.46)	-0.0777** (-2.45)	-0.0014 (-0.06)
		Age	-0.0033 (-1.14)	0.0004 (0.15)	0.0016 (0.54)	0.0019 (0.85)
		_cons	-1.955*** (-2.91)	-1.9133*** (-2.84)	-3.4034*** (-4.58)	-1.4686 (-2.77)
	Inflated (Probit Selection Part) _cons					-18.8153 (-0.04)
/lnalpha					-0.4044*** (-6.10)	
alpha					0.6674	

420 Note. Standard deviation in parenthesis. * p < 0.10; **p < 0.05; ***p < 0.01.

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423 Regarding industry-specific factors, there are interesting results. Industry-specific factors
424 positively influence eco-process innovations, but influence eco-product innovations insignificantly.
425 Among eco-process innovations, when average energy consumption in an industry is higher,
426 possibility of innovation is higher in areas including (2) reducing energy consumption per output
427 unit, (3) reducing carbon dioxide emission, (5) reducing soil, water, noise, and air pollution, and (6)
428 recycling of wastes, water, and materials. This means that firms in a high energy consumption
429 industry are focusing more on the benefit from cutting down their energy consumption rather than
430 consumers' energy consumption in product use. Also in manufacturing processes, they concentrate
431 more on the innovative actions which bring reduction outcomes in a relatively short period of time.
432 But in the processes which need investment and research for a relatively longer period of time, such
433 as replacement of pollutants or harm matters, innovative actions are less likely to happen at least in
434 short term. Industry-specific factors have influences on eco-innovation possibilities of companies, but
435 not on eco-innovation outcomes.

436 *4.2. The Results of Empirical Analyses of Internal Factors*

437 As one of our focusing variables, let us see how openness to information affects eco-innovation.
438 First, when the scope of obtaining information is broader and more diverse, the diversity of eco-
439 innovation improves. This result is consistent with Laursen and Salter [28] which studied general
440 technology innovation. Hypothesis 4-1, therefore, is supported. In Korea, as many researchers
441 suggest, eco-innovation requires capabilities to deal with different dimensions, which can be
442 acquired from diverse external information sources [27,29,31]. So, the firms with broader information
443 sources can be said to get higher outcomes of eco-innovation than those with narrower sources.

444 Also in eco-process and eco-product innovation activities, it has a significantly positive influence
445 on the activities of (1) material, (2) energy, and all activities in eco-product. From this result, firms
446 obtaining information from broader and more diverse sources are more likely to take actions on eco-
447 innovation. This result has great implications on both policy and academic study. In terms of
448 academic study, it suggests the necessity of expense-related studies, as it is possible that more diverse
449 sources of external information accompany higher costs in their handling and management. In terms
450 of policy, the method to raise diversity of external information should be proposed.

451 The importance of openness to information has not showed any significant results in the
452 outcomes and individual items of innovation activity, which is far from the expectations of this study.
453 Therefore, hypothesis 4-2 is not supported. It is probably because of firms' lack of absorbing
454 capability, which refers to firms' ability to effectively use outside information [52,53]. The value of
455 external information depends on firms' potential absorptive capabilities [53-55]. But this result should
456 be strengthened by empirical analyses.

457 *4.3. The Results of Empirical Analyses of Control Factors*

458 Regarding the results about regulatory pull/push, Korean firms show the same results as the
459 previous studies [3,43]. The present regulations positively affect eco-innovation at 1% significance
460 level. Also, governmental subsidiaries show the same results as the present regulations. Both
461 regulatory push and pull have a significantly positive influence on each dimension of eco-process
462 and eco-product innovation. The existences of the present regulations and governmental support
463 have significantly positive relationships with all activities of eco-process and eco-product innovation.
464 Also in the market-pull factors, higher demands on eco-friendly products have greater positive
465 influences not only on eco-process and eco-process innovation, but also on eco-innovation outcome
466 performance. This is consistent with the empirical research results of Kammerer [18]. Next, let us see
467 how influential internal factors are on eco-innovation of Korean firms. First, innovation capability
468 has a significant effect at 1% level. It means that for Korean firms, higher innovation capability
469 promotes eco-innovation. When seeing technology push factors, internal R&D investments have
470 significantly negative relationships with eco-innovation. The reason is that business R&D investment

471 has a negative effect on productivity growth in short run, as Guellec and Potterie [56] argued. They
472 presented that it takes some time for those outcomes to have relationships each other, and before they
473 do, they can show negative relationships. In Seop et al. [57], R&D intensity has a negative relationship
474 with firms' revenues in short run. Meanwhile, external investment is not in significant relationships.

475 The size of firms, which is represented by the number of employees, has a significant effect only
476 partly on eco-innovation. Only eco-innovation activities for carbon dioxide reduction have been
477 proportionally influenced by firm size. In eco-product innovation, the activities regarding energy use
478 reduction have been positively influenced by the size of firms at 10% significance level, though firms'
479 size negatively affects recycling of products. Firm's age, which represents firm's experience, has a
480 positive relationship with the overall outcomes of eco-innovation.

481 5. Conclusions

482 This study has empirically proved the determinant factors of the eco-innovation of Korean
483 manufacturing firms, divided into external and internal factors, mainly by using the variables that
484 have not been much proved. Both anticipated regulations and self-regulations, which are external
485 factors, promote eco-innovation. On the dimension of industry-specific characteristics, firms which
486 belong to a more energy-consuming industry are more concentrated on eco-process innovation. In
487 information sourcing openness, which is an internal factor, breadth is a factor with a more significant
488 influence on eco-innovation than importance is. It means that the capability of a firm to make
489 connections with diverse bodies (businesses, colleges, research institutions, etc.) and apply their
490 information itself has an influence on its choice of eco-innovation. The three variables, anticipated
491 regulations, self-regulations, and the breadth of information sourcing, also have significantly strong
492 influences on firms' eco-innovation outcomes, which are represented by how frequently they engage
493 in eco-innovation activities.

494 According to the empirical results, the following academic and policy implications can be
495 provided. First, it has been already confirmed by a lot of researchers that the government's
496 environmental regulations promote eco-innovations [14,58,59]. This study analyzes how firms react
497 to anticipated environmental regulations imposed by the government, which has not been much
498 addressed in previous studies. As shown in the results, firms take positive response strategies rather
499 than passive defending actions, as anticipated regulations imply that their future competition
500 circumstances will be different. Particularly, the argument that late comers take anticipated
501 regulations as an opportunity to secure competitive advantages and become leading firms, and take
502 more vigorous actions for technological innovations strengthens the validity of the results of this
503 study [60].

504 When firms clearly see the direction of environmental policies, they decide on their strategies
505 and respond to anticipated circumstantial changes. The consistency and continuation of the
506 government's environment policies, therefore, are important. But even when firms are aware of
507 external circumstantial changes, they cannot be immune from the problem of uncertainty. Firms are
508 more likely to take passive actions when uncertainty is high, while they are more likely to take active
509 actions when uncertainty is low and there is improved predictability. When it comes to activities
510 related to eco-innovation, the predictability of future regulations can be explained by the same theory.
511 Due to the limitations of our data, however, future studies should be conducted based on related
512 studies.

513 Second, apart from governmental regulations, self-regulations have a positive influence on
514 firms' engagement in eco-innovation activities and their performance. There is a lack of concrete
515 discussion about the mechanism through which self-regulations have such influences. In this study,
516 negative and positive influences of self-regulations are presented, and the empirical analyses are
517 carried out to prove them. As shown from the results, the positive relationship of self-regulation with
518 eco-innovation suggests that self-regulations have positive effects in Korea, and firms should be
519 induced to take voluntary actions on environment-related innovation activities by themselves
520 through related policies. Especially, the realization of self-regulation leads to the preparation of

521 effective methods to replace non-elastic governmental regulations [23]. From the government's
522 perspective, self-regulations can reduce external effects from the establishment of rules and cut down
523 the costs on persuading various interest groups. For these purposes, it is important to prepare a
524 foundation on which sound self-regulations can be established, and the government and firms should
525 make joint efforts to do so. Third, concrete identify of the relationship between industry-specific
526 factors and eco-innovation. Although the results of some studies have presented that firms which
527 belong to a high energy-consuming industry are active for eco-innovation, they might be missing a
528 concrete influential relationship. As the result of this study shows, industry-specific factors do not
529 have a significant influence on eco-product innovation, but have a significant influence on eco-
530 process innovation. Particularly, it is significant in some kinds of eco-innovation, such as energy
531 consumption reduction, carbon dioxide reduction, soil/water/noise/air pollutants reduction, and
532 wastes/water/material recycling. It suggests that firms that consume a lot of energy practice more
533 process-centered eco-innovation policies. Fourth, the major contribution of this study is that it has
534 figured out that various information sources could help firms win a competitive advantage through
535 eco-innovation. Since eco-innovation intrinsically has a complex development process and multiple
536 purposes, using diverse external information is important [27,29]. Also, multiple dimensions such as
537 design, user involvement, product and service, or governance should be taken into consideration in
538 the process of eco-innovation [27]. It is also well explained in this study as it presents the positive
539 relationship between the breadth of information sources and eco-innovation. In particular, the
540 positive relationship with overall eco-innovation suggests that firms which want to win competitive
541 superiority through product differentiation need to actively use external resources. Meanwhile, from
542 firms' point of view, the importance of external information does not influence eco-innovation
543 engagement and outcomes. It seems to have something to do with absorbing capability, though there
544 should be related further studies in the future.

545 Despite the implications presented above, this study has several limitations. First, it could not
546 fully take into consideration the temporal effect of each factor considered in the analyses on eco-
547 innovation. In future studies, temporal research should be done on the same firms analyzed in this
548 study. Second, since it could not figure out whether firms take predicted regulations as opportunities
549 or threats due to the limit of data, the changes of firms' behaviors were not explained either. If more
550 research is done on this issue, it could provide important implications on how the strategy
551 formations, actions, and outcomes of companies will change depending on their awareness of
552 anticipated regulations.

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554

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556 Supervision: Y.S.H.; Writing original draft: C.Y.; Writing—review and editing: Y.S.H.

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562 Reference

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