

# Viaduct maintenance for future traffic demands and earthquakes

Omura, Takashi; Kaewunruen, Sakdirat

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### **Title (94 characters, including spaces)**

Econometric analysis of viaducts maintenance considering future traffic demand and earthquakes

#### Author 1

- Takashi Omura, MEng, MSc
- Department of Civil Engineering, University of Birmingham, Birmingham, United Kingdom
- [ORCID number 0000-0003-4313-5928](https://orcid.org/0000-0003-4313-5928)

#### Author 2

- Sakdirat Kaewunruen, PhD
- School of Civil Engineering Birmingham Centre for Railway Research and Education, University of Birmingham, Birmingham, United Kingdom
- [ORCID number 0000-0003-2153-3538](https://orcid.org/0000-0003-2153-3538)

### **Full contact details of corresponding author**

- Sakdirat Kaewunruen
- Contact address: Edgbaston Birmingham B15 2TT United Kingdom
- Email: s.kaewunruen@bham.ac.uk

## **Abstract**

Tokyo Metropolitan Expressway has operated for more than half a century. Recently, serious damages in the network have been reported in many of the old routes. In contrast, the Metropolitan Expressway has little to none of experience in managing such a situation so far. Thus, developing an appropriate management strategy focusing around maintenance is critical to the Expressway. The emphasis of this study is placed on the maintenance improvement of steel viaducts and the project aims to evaluate its marginal maintenance cost and identify the influences on the cost from uncertainties such as earthquakes and future traffic demand from an econometric perspective. The study reveals that the traffic volume of passenger cars can be identified as a significant factor although the effect of earthquake events on the cost is not clearly pronounced. Based on the analyses, it is found that the current maintenance approach is capable of dealing with fluctuation of traffic volume, which is the most influential factor. Furthermore, an increase in the amount of maintenance works could possibly lower the maintenance costs due to the existence of economy of scale. The results also indicate that the efficiency of current maintenance method could be improved.

## **Keywords chosen from ICE Publishing list**

Roads & highways; Viaducts; Economics & finance; Maintenance & inspection

## **List of notation**

*AADT – Annual Average Daily Traffic volume*

*RTS – Returns To Scale*

*SUR model – Seemingly Unrelated to the Regression model*

*FGLS estimation – Feasible Generalized Least Squares estimation*

1    **Introduction**

2    Tokyo Metropolitan Expressway Company Limited (MECL) has been established in 1959 for the  
3    purpose of reducing traffic congestion in and around Tokyo. Recently, deterioration and various  
4    kinds of damage have become prominent in its structures especially in the old expressway  
5    network. Furthermore, most of the Metropolitan Expressway consists of bridges, tunnels and  
6    semi-underground structures (Metropolitan Expressway Company Limited, 2015). Thus, it is  
7    highly important to understand maintenance costs in the structures in terms of traffic volume.

8

9    Link (2005 and 2014) analysed highway maintenance costs from an econometric viewpoint.

10   However, he focused only on highways which consist of embankments. Hence, this study  
11   focused on maintenance costs in a steel structure which is one of the main structures in the  
12   Metropolitan Expressway shown in Figure 1 and derived the maintenance marginal cost in  
13   consideration of the influence of traffic volume. In fact, MECL needs to have its own standard to  
14   judge the best maintenance method depending on the structural damage such as general repair  
15   or structural renewal need to be established. Metropolitan Expressway Route 3 Shibuya Line  
16   ("Route 3"), which is one of the oldest expressways constructed in 1967, was focused.

17   Especially in such old expressways, the suitable maintenance standard is assumed to be  
18   significantly important. Moreover, there have been many earthquakes and they have had large  
19   negative effects on many structures in Japan (Heath, 1995). Although it is difficult to predict  
20   earthquakes precisely, their influences on the maintenance cost should be considered.

21   Therefore, an analysis of the effects of earthquakes as well as the effects by traffic volume was  
22   implemented. This study will play a role to judge more suitable maintenance method in  
23   consideration of future traffic volume and earthquakes.

24

25   The aim of this study is to identify the influence on the maintenance cost for a steel viaduct in  
26   Route 3 from uncertainties such as earthquakes and future traffic volume and the cost efficiency  
27   of the current maintenance method.

28

29

30   **2. Literature review**

31 Many economic approaches with various functions have been taken to express behaviours of  
32 producers in the past (Ferrier and Lovell, 1990 and Podolny 1993). These approaches can  
33 generally be divided into two parts. The first aims to estimate the largest profits by the use of a  
34 production function (Fare, Grosskopf and Pasurka, 2007). The other is to identify an optimal  
35 marginal cost by using a cost function. The marginal cost estimation has been conducted in  
36 various business sectors such as power generation, water utility, bus management, banking and  
37 agricultural industries (Atkinson and Halvorsen, 1984, Bottasso and Conti, 2009, Mizutani and  
38 Urakami, 1999, Viton, 1981 and Coelli, 1995). Cost functions used in past studies can be  
39 divided into two groups. The first group is a function, which has no theoretical economic  
40 background (Ford and Warford, 1969, Mann and Mikesell, 1976 and Morgan, 1977). The other  
41 is a function based on the economic corporate behaviour principle, where any enterprise seeks  
42 to minimise cost of input factors under production cost as a key criterion (Feigenbaum and  
43 Teeple, 1983, Pulley and Braunstein, 1992 and Kim, 1987). In the former, cost is regarded as  
44 explained variable and the factors considered to influence on the cost is regarded as an  
45 explanatory variable. In the latter, a cost function with an economic theoretical background  
46 expresses a mathematical formula between the cost, production output and input factor, which  
47 is demonstrated in Equation (3).

48

49 Moving on to cost function models, four types of cost function models such as linear, log linear,  
50 Cobb-Douglas and translog models were used in previous research. Linear and log linear cost  
51 function models have no theoretical economic background. On the other hand, other two types  
52 of cost function models such as Cobb-Douglas and translog models are based on theoretical  
53 economic background. Particularly, the translog cost function model introduced by Christensen,  
54 Jorgenson and Lau (1973) is more flexible than Cobb-Douglas model in terms of having the  
55 ability to deal with changeable elasticity of substitution. Thus, it can be assumed that the  
56 translog cost function model express the minimum cost of production more precisely than other  
57 models. Clark and Speaker (1994) calculated scale of economy in the banking business by use  
58 of a translog cost function. As for scale of economy, Deller, Chicoine and Walzer (1988)  
59 researched whether introduction of larger units could achieve cost saving in consideration of  
60 rural road management.

61

62 Recently, as for highway management, Link (2006) analysed renewal marginal cost in German  
63 highways and the relationship between traffic volume and the renewal cost by using the translog  
64 cost function. Furthermore, Link (2014) analysed the relationship between traffic volume and  
65 maintenance cost, and calculated the cost elasticity and the marginal maintenance cost for  
66 pricing determination. As a result of the research, a decreasing elasticity curve and decreasing  
67 marginal cost curve could be derived. Moreover, the research also provided evidence for price-  
68 inelastic factor and existence of returns to scale in the course of road maintenance. As  
69 described above, the translog approaches have been adopted to evaluate various kinds of  
70 public infrastructure industry. Meanwhile, MECL which runs the Metropolitan Expressway has  
71 consistently managed the expressway and has attached the heaviest weight to achieving the  
72 highest user convenience at a minimal cost since its establishment (Metropolitan Expressway  
73 Company Limited, 2017a). In other words, the company has not always run its expressway to  
74 maximise its profit margin as its focus is the public good. Hence, using a translog approach  
75 which is appropriate for deriving cost minimising behaviour is assumed to fit the corporate  
76 mission. Furthermore, it should be crucial for the company which owns various kinds of roads to  
77 understand their optimal maintenance cost and the factor with uncertainty which influences  
78 positive and negative impact on them. Thus, this study analysed optimal maintenance cost and  
79 the influential factors in a steel road structure nobody has ever tackled.

80

### 81 **3. Maintenance methods for the Metropolitan Expressway**

82 Since the total length of Metropolitan Expressway is more than 300km and its structure types  
83 have gradually become diverse since it opened, MECL created an inspectional manual for  
84 maintaining the expressway. In addition to that, MECL has undertaken effective and timely  
85 renewal of the manual. The manual shows the flow of inspection, the type of inspection  
86 depending on the purpose and the situation, the method, required skills and qualifications for a  
87 maintenance engineer and the standard for inspectional results. The criteria to judge the  
88 necessity of maintenance is quite important among it. When structures are inspected, the spots  
89 are classified according to 4 grades of seriousness listed in Table 1. Fundamentally, serious  
90 damage classified as rank A or B are regarded as needing to be repaired in the maintenance

91 strategy. Therefore, maintenance costs analysed in this study are caused by the maintenance  
92 works for damage classified as rank A and B. Furthermore, the manual evaluates grades of  
93 damages in consideration of the effects on the performance required for a structure. As Table 2  
94 shows, the performance can be categorised into “safety”, “usability” and “sociality”. Although  
95 safety and usability are obviously important, MECL regards sociality to be as important as other  
96 two performances. Note that “Sociality” means harmony of the expressway and the environment  
97 along it in terms of its appearance, noise, vibration and so on. The Metropolitan Expressway  
98 exists almost solely in the most densely populated areas in Japan. Therefore, the way of  
99 grading damage is assumed to be focused more on sociality than other Japanese roads.

100

101

## 102 **4. Methodology**

### 103 **4.1 Translog cost function method**

104 As mentioned before, many scholars have used economic approaches such as cost functions to  
105 identify relationships between cost, output and factor of production. In addition, Coelli (1995)  
106 stated a cost function can represent a minimum cost from a given series of inputs, whereas a  
107 production function can represent maximum output. Since MECL considers minimum-cost  
108 management as a corporate mission, this study also aims to identify a minimum operational  
109 cost. Specifically, a translog cost function was used to analyse the relationship between  
110 maintenance cost, traffic volume as an output, and maintenance marginal cost for a criterion to  
111 introduce a feasible maintenance plan. The analysis period was 10 years between 01/04/2007  
112 and 31/03/2016. Characteristically, annual average daily traffic volume (“AADT”) of passenger  
113 and large-sized cars were used as a main explanatory variable. Earthquake frequency was also  
114 used as an explanatory variable. Furthermore, labour cost, material and machinery cost  
115 (“material cost”), and capital cost are necessary to implement expressway maintenance and are  
116 considered as factors of production. The damage which needs maintenance works is assumed  
117 to be reflected in levels of maintenance costs.

118

119 The meaning and derivation of a translog cost function are explained as follows. First, when  $x_i$   
 120 is factors of production and output  $Y$  is an input of factors of production, a production function  
 121 can be shown below.

122

$$Y = f(x_1, x_2, x_3, \dots)$$

$x_i$ ; factors of production

123

(1)

124

125 A cost function can be illustrated as a formula (2) because a production function and a cost  
 126 function have antipodal relationship each other.

127

$$Cost = g(Y_1, Y_2, \dots, P_1, P_2, P_3, \dots)$$

$Y_i$ : Economic goods as an output,  $P_j$ : price of factors (of production)

128

129

(2)

130

131

132 When a formula (2) is logarithmic transformed and applied to Taylor's expansion, formula (3)  
 133 can be obtained.

134

$$\begin{aligned} \ln Cost = & \alpha_0 + \sum_i \beta_i \ln P_i + \frac{1}{2} \sum_i \sum_j \beta_{ij} \ln P_i \ln P_j + \sum_l \gamma_l \ln Y_l + \frac{1}{2} \sum_l \sum_m \delta_{lm} \ln Y_l \ln Y_m \\ & + \sum_i \sum_l \rho_{il} \ln P_i \ln Y_l \end{aligned}$$

135

(3)

136

137 In this study, expressway viaducts focused on were made of steel and constructed in 1967.  
 138 AADT of passenger and large-sized cars were denoted by  $Y_p$  and  $Y_f$  as produced economic  
 139 output. Moreover, if labour cost  $P_L$ , material cost  $P_M$  and capital cost  $P_C$  are defined as factors of  
 140 production, a cost function can be shown below. Capital cost  $P_C$  is regarded as depreciation cost  
 141 which annually needs to be paid depending on the size of the expressway asset value.

142

$$Cost = f(Y_p, Y_f, P_L, P_M, P_C)$$

143

(4)

144

145 In addition, higher earthquake frequencies tend to increase maintenance cost and was added  
 146 as a dummy variable N to a constant term which illustrates environmental condition in the  
 147 expressway structure. The essential conditions for homogeneity in price of factors and for  
 148 symmetry can be illustrated below (Link, 2006).

149

$$\sum_i \beta_i = 1, \sum_j \beta_{ij} = 0, \sum_i \rho_{ii} = 0, \beta_{ij} = \beta_{ji}$$

150

(5)

151

152 Based on this explanation above, the translog cost function used in this study can be exhibited  
 153 below.

154

$$\begin{aligned} \ln Cost = & c + \alpha \cdot \ln N + \beta_L \ln P_L + \beta_M \ln P_M + \beta_C \ln P_C + \gamma_p \ln Y_p + \gamma_f \ln Y_f \\ & + \frac{1}{2} (\beta_{LL} \ln^2 P_L + \beta_{MM} \ln^2 P_M + \beta_{CC} \ln^2 P_C + \delta_{pp} \ln^2 Y_p + \delta_{ff} \ln^2 Y_f) + \beta_{LM} \ln P_L \ln P_M \\ & + \beta_{LC} \ln P_L \ln P_C + \beta_{MC} \ln P_M \ln P_C + \delta_{pf} \ln Y_p \ln Y_f + \rho_{Lp} \ln P_L \ln Y_p + \rho_{Lf} \ln P_L \ln Y_f \\ & + \rho_{Mp} \ln P_M \ln Y_p + \rho_{Mf} \ln P_M \ln Y_f + \rho_{Cp} \ln P_C \ln Y_p + \rho_{Cf} \ln P_C \ln Y_f \end{aligned}$$

155

Description of variables

*Cost* : Maintenance cost (£/m\*year)       $Y_p$  : Traffic volume of passenger car (vehicles/day)  
*L* : Labour cost (£/m\*year)               $Y_f$  : Traffic volume of large-sized car (vehicles/day)  
*M* : Material cost (£/m\*year)             $N$  : Earthquake frequency (numbers/year)  
*C* : Capital cost (£/m\*year)

156

157

(6)

158

159 The cost-share functions in terms of labour, material and capital cost can be shown in equations  
 160 (7), (8) and (9) by use of Shephard's lemma (Shepherd, 1970).

161

$$S_L = \frac{\partial \ln Cost}{\partial \ln P_L} = \beta_L + \beta_{LL} \ln P_L + \beta_{LM} \ln P_M + \beta_{LC} \ln P_C + \rho_{Lp} \ln Y_p + \rho_{Lf} \ln Y_f$$

162

(7)

$$S_M = \frac{\partial \ln Cost}{\partial \ln P_M} = \beta_M + \beta_{MM} \ln P_M + \beta_{LM} \ln P_L + \beta_{MC} \ln P_C + \rho_{Mp} \ln Y_p + \rho_{Mf} \ln Y_f$$

163

(8)

$$S_C = \frac{\partial \ln Cost}{\partial \ln P_C} = \beta_C + \beta_{CC} \ln P_C + \beta_{LC} \ln P_L + \beta_{MC} \ln P_M + \rho_{Cp} \ln Y_p + \rho_{Cf} \ln Y_f$$

164

(9)

165

166 The cost-share function can be rearranged below in reference to equations (7), (8) and (9)

167 (Subal, 1997).

168

$$S_i = \beta_i + \sum_j \beta_{ij} \ln P_j + \sum_l \rho_{jl} \ln Y_l$$

169

(10)

170 The sum of error terms is 0 because the sum of all cost shares is 1. Therefore, parameters in  
171 the function (7), (8) and (9) cannot be estimated because the error variance and the covariance  
172 matrix are singular. Thus, when cost-share functions are estimated at the same time, one  
173 arbitrary function needs to be removed from the three cost-share functions  $S_L$ ,  $S_M$  and  $S_C$ . In  
174 other words, the three functions including the translog function (6) and two cost-share functions  
175 were used to estimate parameters, thereby allowing the removal of the arbitrary one. Moreover,  
176 it is presumed there is correlation between error terms in each function and each sample has no  
177 correlation (Bilodeau and Duchesne, 2000). This system is said to be seemingly unrelated to the  
178 regression model (SUR model) and it is estimated by the feasible generalized least squares  
179 (FGLS) estimation method. As stated above, maximum likelihood estimates can be found  
180 (Bilodeau and Duchesne, 2000).

181

## 182 4.2 Software

183 The author used MATLAB R2017a for the FGLS estimation (MATLAB, 2018).

184

### 185 **4.3 Input data**

186 This study uses the real data of maintenance costs for the Route 3. Along the route, one bridge  
187 is 27m long with 2 lanes and is assumed to be maintained routinely. This bridge was focused  
188 on, as shown in Figure 2 and 3. The road is a charged expressway in Tokyo's urban area and  
189 its AADT ranged from roughly 75,000 to 110,000 cars per day (during the analysis period). The  
190 structure consists of a steel girders and piers and it was built in 1967. Recently, maintenance  
191 works involving repairing damage have been frequently implemented. Labour and material costs  
192 spent past 10 years in maintenance works for the bridge were used as analysis data. The  
193 maintenance works include only works on the steel bridge structure, which greatly influences  
194 future maintenance strategy. Therefore, other maintenance works for pavements and other  
195 facilities were not analysed. Furthermore, the depreciation cost of the asset, which has been  
196 used for maintenance, was considered as a capital cost. Although it is necessary to understand  
197 construction cost at the time of constructed precisely for accurate calculation of the depreciation  
198 cost, there was no data relevant to the construction cost. However, this problem could be solved  
199 by use of a deflator. The deflator shows the ratio between two construction costs when similar  
200 buildings are constructed now and in the past. Herewith, the expressway construction cost in  
201 1967 can be calculated by using the cost of the same structural expressway construction  
202 recently. The equation below based on the present value of the expressway bridge and relevant  
203 ratios calculates its depreciation cost defined by National tax agency in Japan (National Tax  
204 agency, 2017). The present value is calculated by use of the construction cost mentioned before  
205 and maintenance cost which increases asset value. Furthermore, the durable life of the  
206 expressway is determined by its physical life. The depreciation procedure needs to be continued  
207 until the price becomes 10% of its acquisition cost in case the expressway asset value  
208 increased.

209

$$\text{Depreciation cost per year} = P \times 0.9 \times 0.023$$

*P: Present value*

*0.9: Ratio of total depreciation cost*

*0.023: Depreciation rate per year*

210

(11)

211

212 For the reasons aforementioned, 3 types of costs such as labour, material and capital cost were  
213 regarded as factors of production. The price of the factors, passenger and large-sized cars'  
214 AADT, and earthquake frequency are set as explanatory variables for maintenance costs listed  
215 in Table 3. Large-sized cars are defined as coaches, large trucks, trailers and special vehicles  
216 such as construction vehicles. Although it was desirable to use vehicle load data, two types of  
217 data mentioned before were used for analysis because of having no access to axle-load data.  
218 Therefore, the results were limited to the figures for average passenger and large-sized cars  
219 without considering detailed weight classes. The intensity of earthquakes was limited to more  
220 than what people can feel, as per the Japan Meteorological Agency seismic intensity scale. The  
221 official scale does not show the scale of earthquake itself but shows the intensity of shaking  
222 caused by earthquakes at an observation point. Moreover, the scale has 10 grades specified by  
223 accelerometers. By definition, if the seismic intensity is more than 1, the earthquake can be  
224 physically felt by people. In addition, traffic volume was derived from traffic counters densely  
225 allocated along the expressway. Data gaps were assumed not to affect the results because the  
226 failures of devices and their deficits are quite small. Although Link (2005) used the number of  
227 days, which had temperature fluctuations around 0 degrees Celsius as an explanatory variable  
228 for the renewal cost in German highways, this study does not use the explanatory variables due  
229 to the relatively small amount of available data in Tokyo.

230

231

#### 232 **4.4 MATLAB feasible generalized least squares (FGLS) estimation**

233 Parameter estimation was implemented by use of the translog cost function and cost share  
234 equations as explained in section 4.1. Since 10 years' data from 2007 to 2016 was analysed, a  
235 total of 30 equations were used to estimate parameters. The data and program code utilized in  
236 the estimation are listed in Figure 4 and 5.

237

238

#### 239 **5. Input data analysis**

240 This section focuses on input data used in parameter estimation. This data includes the number  
241 of earthquakes, AADT of passenger and large-sized cars, and factors of production. First,  
242 number of earthquakes shown in Figure 6 is checked. The earthquakes focused are large  
243 enough to feel by human. In addition, they are only available and objective data observed in  
244 Japan Meteorological Agency (Japan Meteorological Agency, 2018). As shown in the figure, the  
245 number of earthquakes decreased from 2007 to 2009. However, it suddenly rose in 2010 and  
246 was also high in 2011. The rise was believed to be influenced by the occurrence of Great East  
247 Japan earthquake and its aftereffects. Although the earthquake occurred in March 2011, Figure  
248 6 illustrates it in 2010 because the Japanese annual fiscal year from April to March was used.  
249 After that, the earthquake frequency decreased from 2012 to 2015, and then it slightly increased  
250 in 2016.

251

252 Second, the AADT of passenger and large-sized cars is shown in Figure 6. These two kinds of  
253 traffic have gradually decreased in volume over the last 10 years. Especially in 2010, the  
254 volume significantly decreased. A possible reason was that a new ring road was partially  
255 opened in 2010. The ring road called the Central Circular route is expressed by a red line in  
256 Figure 7 and acted as an alternative to Route 3. As a result, the traffic volume decreased. As for  
257 passenger cars, traffic volume remained at the same level from 2010 to 2016. On the other  
258 hand, traffic volume of large-sized cars continued to decrease after 2011. The Central Circular  
259 Route has possibly influenced large-sized cars more than passenger cars.

260

261 Third, factors of production focused in the research are explained. Labour and material cost  
262 showed similar movement during analysis period. This was possible because these two types of  
263 costs were mainly for maintenance works. In addition, capital costs showed increasing trend for  
264 10 years. This movement was assumed to be highly related to expressway asset value.

265

266 Lastly, future prospects are explained. As for earthquake frequency, it is difficult to estimate it  
267 precisely. However, it is possible to estimate traffic volume to some extent. First, the Olympic  
268 Games will be held in Tokyo in 2020. Although traffic demand in Tokyo metropolitan area will be  
269 higher, Tokyo Metropolitan Government will aim to cut the traffic volume in the area during the

270 Olympic Games by 15 percent from general weekly levels (The Japan Times, 2018). In addition,  
271 the three ring expressways connecting the Greater Tokyo Area will be completed in the near  
272 future as shown in Figure 7 (Tokyo Metropolitan Government Bureau of Construction, 2018).  
273 These events could have effects on the traffic situation. In particular, the completion of the three  
274 ring expressways could make traffic flow much smoother and more effective (Oguchi,  
275 Chikaraishi, Iijima et al., 2016), as a result, the traffic volume in radial expressway routes such  
276 as the Route 3 will decrease after the completion of the three ring expressways.

277

278

## 279 **6. Estimation Results**

### 280 **6.1 Parameter estimation**

281 Table 4 shows the regression estimate results by use of the translog cost function and the cost-  
282 share functions explained in the previous section. It is assumed the results of the estimation are  
283 largely confirmed to be statistically stable without  $\gamma_p$ ,  $\gamma_f$ ,  $\beta_{CC}$  and  $\rho_{CP}$  due to standard error. On  
284 the other hand, the influence on maintenance cost by earthquake frequency and capital cost  
285 cannot be confirmed because the coefficients are too small, which means capital cost is not a  
286 supportive coefficient in this case. Moreover, since parameter  $\gamma_f$  is shown to be a negative  
287 value, the traffic volume of large-sized cars possibly decreases maintenance costs. Actually,  
288 traffic volume is not measured by an axle load of each vehicle but by a length of each vehicle.  
289 Generally speaking, weight directly influences on structure deterioration. Thus, the phenomenon  
290 could possibly occur because of the measuring method of traffic volume on the expressway.  
291 Furthermore, the estimation accuracy of parameter  $\gamma_f$  is low. Hence, additional parameter  
292 estimation is conducted afterwards.

293

294

### 295 **6.2 Price elasticity**

296 Price elasticity can be calculated from the estimated parameters. That price elasticity can be  
297 divided into the elasticity between any pair of input factors and the own-price elasticity of each  
298 factor. These two kinds of elasticities can be calculated by applying the Allen-Uzawa  
299 substitution elasticities (Uzawa, 1962).

300

$$\varepsilon_{ii} = \frac{\beta_{ii} + S_i(S_i - 1)}{S_i^2}$$

$$i = L, M, C$$

$\varepsilon_{ii}$ : Own – price elasticities of each factor

301

(12)

$$\varepsilon_{ij} = \frac{\beta_{ij} + S_i \cdot S_j}{S_i \cdot S_j}$$

$$i, j = L, M, C$$

$\varepsilon_{ij}$ : Substitution elasticities between any pair of input factors

302

(13)

303

304 A transition of own-price elasticities of three factors are shown in Table 5 and Figure 8 by use of  
 305 parameter estimation in the previous section. As a result of the transition, labour and material  
 306 costs are substitutes because of their values being less than 0, while capital cost can be  
 307 understood as a complementary factor. Even if capital cost rises, the demand will increase.  
 308 Ryan and Wales (1999) stated translog cost functions needed to be concave in prices, in  
 309 addition, the Hessian matrix of the cost functions should be negative semidefinite as a  
 310 necessary condition for concavity. This is the same as the cost minimizing condition. In other  
 311 words, capital cost does not meet the cost minimizing condition. As mentioned before,  
 312 parameter estimation of capital cost is still in doubt in terms of its accuracy. Thus, parameter  
 313 estimation without a factor of capital cost needs to be implemented. However, as mentioned in  
 314 6.1 section, the influence of capital cost is quite small. In other words, the influence can be  
 315 discounted. Thus, the analysis with the parameter shown in Table 4 will also be implemented  
 316 continuously. The translog function and cost share functions without a factor of cost function  
 317 used in the estimation are as follows.

318

$$\begin{aligned} \ln Cost = & c + \alpha \cdot \ln N + \beta_L \ln P_L + \beta_M \ln P_M + \gamma_p \ln Y_p + \gamma_f \ln Y_f \\ & + \frac{1}{2} (\beta_{LL} \ln^2 P_L + \beta_{MM} \ln^2 P_M + \delta_{pp} \ln^2 Y_p + \delta_{ff} \ln^2 Y_f) + \beta_{LM} \ln P_L \ln P_M + \delta_{pf} \ln Y_p \ln Y_f \\ & + \rho_{Lp} \ln P_L \ln Y_p + \rho_{Lf} \ln P_L \ln Y_f + \rho_{Mp} \ln P_M \ln Y_p + \rho_{Mf} \ln P_M \ln Y_f \end{aligned}$$

319 (14)

$$S_L = \frac{\partial \ln Cost}{\partial \ln P_L} = \beta_L + \beta_{LL} \ln P_L + \beta_{LM} \ln P_M + \rho_{Lp} \ln Y_p + \rho_{Lf} \ln Y_f$$

320 (15)

$$S_M = \frac{\partial \ln Cost}{\partial \ln P_M} = \beta_M + \beta_{MM} \ln P_M + \beta_{LM} \ln P_L + \rho_{Mp} \ln Y_p + \rho_{Mf} \ln Y_f$$

321 (16)

322

323 The results of parameter estimation are listed in Table 6. First, estimation accuracy of  
324 parameters is assumed to be significantly improved more than previous estimation in terms of  
325 standard error. However, parameter tendency as the results show is quite similar to the previous  
326 estimation shown in Table 4. Thus, it cannot be stated unconditionally that the results of  
327 previous estimation have a problem in their accuracy. In addition, it is assumed traffic volume of  
328 passenger cars and maintenance cost have a proportional connection because of two reasons  
329 as follows. One is the value  $\gamma_p$  is greater than  $\gamma_f$  according to the results. The other is traffic  
330 volume of passenger cars is significantly higher than that of large-sized cars. However, the  
331 influences on maintenance cost by passenger and large-sized cars need be considered.

332

333 As for own-price elasticities, all figures illustrated in Table 7 and Figure 9 are less than 0,  
334 thereby showing the existence of the own-price elasticities over an entire period. Therefore, the  
335 results are consistent with cost minimizing conditions. On the other hand, in comparison with  
336 labour and material costs as factors of production, these two factors are close to 0 as Figure 8  
337 shows. Therefore, labour and material costs do not necessarily have price elasticities.

338

339 Secondly, the results of substitution elasticities shown in Table 8 and Figure 10 are explained.  
340 Although the figures of labour and material costs are positive, they are close to 0. Thus, these  
341 two factors of production are independent rather than substitutes. On the other hand, for  
342 reference purposes only, other substitution elasticities from previous estimations shown in  
343 Figure 10 were more than 0 over an entire period and expressed considerably similar  
344 movements. Therefore, it is assumed these two kinds of elasticities can be substitutes. The  
345 movement was highly influenced by the transition of the three cost factors.

346

347 Price elasticities are focused on in this section. Labour and material cost are independent  
348 factors as for substitution elasticity. Moreover, though there is a problem about estimation  
349 accuracy in capital cost, as for own-price elasticity, both labour and material cost have also  
350 shown independent trends. Labour and material costs are assumed to not be substitutes nor  
351 complements because of their roles, though both of them are essential for maintenance works.  
352 Moreover, capital cost is assumed to have a strong relationship with the maintenance quantity  
353 which influences expressway asset value. Furthermore, according to the rising quantity of  
354 maintenance works as a result of Great East Japan earthquake in 2011, expressway asset  
355 value, capital cost and the price elasticity have temporally increased. Demand fluctuation for  
356 maintenance can influence considerably capital cost.

357

358

### 359 **6.3 Returns to scale (RTS)**

360 Next, returns to scale (RTS) is analysed. The definition is generally to be the proportional  
361 increase in outputs that would result from a proportional increase in all inputs (Panzar and  
362 Willig, 1977). The expressway focused is one of the main roads in Tokyo's central area.  
363 Furthermore, its traffic volume is forecasted to fluctuate in the future due to the completion of  
364 the three ring expressways and the Tokyo Olympic Games. Thus, getting a grasp of RTS is  
365 important. However, there are two cases of RTS. One is a situation that only one output such as  
366 traffic volume of passenger cars or large-sized cars increases N times more than before when  
367 maintenance cost increases N times more than before. Another situation is all outputs increase  
368 N times more than before in the same situation mentioned before. Although plural outputs such  
369 as traffic volume of passenger and large-sized cars are considered, these two outputs are  
370 assumed to be correlated with each other. Hence, the latter situation is more appropriate for this  
371 study. The latter situation, known as overall scale economies, can be shown by transforming the  
372 translog function (17). If the size of the result is less than 1, RTS is regarded to come into play  
373 (Noulas, Ray and Miller, 1990). In this study, if RTS can be confirmed, less input such as  
374 maintenance cost can generate same amount of output as current one.

375

$$\begin{aligned}
RTS &= \sum_l \left( \frac{\partial \ln Cost}{\partial \ln Y_l} \right) \\
&= \beta_p + \beta_f + \delta_{pp} \ln Y_p + \delta_{ff} \ln Y_f + \delta_{pf} \ln Y_p + \delta_{fp} \ln Y_f + \rho_{Lp} \ln P_L + \rho_{Lf} \ln P_L \\
&\quad + \rho_{Mp} \ln P_M + \rho_{Mf} \ln P_M + \rho_{Cp} \ln P_C + \rho_{Cf} \ln P_C
\end{aligned}
\tag{17}$$

376

377

378 The results are shown in Table 9 and Figure 11. The value of RTS remained close to 0 from  
379 2007 to 2016 as is the case with the previous estimation. Therefore, existence of RTS can be  
380 found from the results because the value during the entire period has been less than 1. Hence,  
381 less maintenance cost as input can generate same traffic volume as output if the situation is  
382 same as current condition. For example, if the amount of maintenance works is increased and  
383 the works are done all at once, the maintenance cost can be reduced.

384

385

#### 386 **6.4 Marginal maintenance cost**

387 Marginal cost for maintenance works is evaluated based on parameter estimation calculated in  
388 the previous section. Since traffic volume of passenger cars is considered to be the most  
389 influential factor, the relationship between traffic volume and marginal maintenance cost needs  
390 to be confirmed. If marginal maintenance cost is considerably influenced by change in traffic  
391 volume of passenger cars, current maintenance method has room to be improved for cost  
392 efficiency. However, if the change has little effect on maintenance cost, current maintenance  
393 method assumed to be cost-effective. In the calculation of marginal maintenance cost, 10 years'  
394 average data for earthquake frequency, large-sized cars AADT, labour, material and capital cost  
395 are used. The results are listed in Figure 12, which consists of the parameters by use of the  
396 renewal translog model (14) and the parameters shown in Table 4 derived from first translog  
397 model (6) as a previous estimation. The difference between these two estimations is present  
398 with or without capital cost. As a result, these two models displayed the same tendencies. First,  
399 marginal cost significantly increases between 0 and 30,000 cars per day. Then, the cost  
400 remains almost the same when traffic volume rises. Thus, even if traffic volume considerably  
401 fluctuates from its current situation of about 60,000 cars per day, it is assumed maintenance

402 cost will not drastically change by use of the current maintenance method. In other words,  
403 current maintenance method is assumed to be economically efficient.

404

405

## 406 **7. Conclusions**

407 The Metropolitan Expressway recently has suffered serious damage especially in the old routes.

408 Therefore, optimal maintenance methods for the expressway have been more important than

409 before. This study focused on maintenance cost in a steel viaduct in “Metropolitan Expressway

410 Route 3 Shibuya Line”, and analysed the marginal maintenance cost and the influences on the

411 maintenance cost from uncertainties such as earthquakes and future traffic volume from an

412 econometric perspective. As for analysis method, labour, material and capital costs related to

413 the viaduct maintenance are evaluated as input factors for a translog cost function. In addition,

414 traffic volume of passenger and large-sized cars are used as output to calculate price elasticities

415 of input factors, RTS and a marginal maintenance cost.

416

417 First, in parameter estimation, the result indicated traffic volume of passenger cars was the most

418 influential factor of maintenance cost. On the other hand, this study could not confirm the

419 influence of earthquake frequency on the maintenance cost. Although the Great Hanshin-Awaji

420 Earthquake in 1995 actually caused destructive damage to many infrastructure facilities such as

421 the Hanshin Expressway bridges (Miki and Sasaki, 2005), some seismic countermeasures of

422 both current reinforced concrete and steel piers were implemented in addition to the introduction

423 of new seismic design afterwards (Yasuda and Ogasawara, 2004). Such countermeasures are

424 assumed to minimise the negative effects of earthquakes. As a result, it is assumed the effect of

425 earthquakes on maintenance cost were not observed.

426

427 As for own-price elasticities, labour and material costs showed independent tendencies.

428 Moreover, the results are quite similar those outlined by Link (2014). However, capital cost

429 showed a complementary tendency. The tendency means the capital demand will rise later on

430 when the cost increases. That can be easily estimated from the relationship between

431 depreciation cost which consists of capital cost and expressway asset value. In other words, it is  
432 assumed the results showed the actual movement of the costs well.

433

434 Furthermore, RTS was consequently confirmed as Link (2014) suggested. Therefore, current  
435 traffic volume can be maintained by use of less maintenance cost than current one in the  
436 following situation. If the amount of maintenance works is increased and the works are done all  
437 at once, the more cost-effective maintenance can be achieved.

438

439 As for marginal cost, even if traffic volume significantly fluctuates, it is highly possible  
440 maintenance cost will not change considerably. In other words, maintenance cost will not  
441 drastically change if the current maintenance method continues to be used.

442

443 Lastly, according to the analysis of the results, the current maintenance method should not be  
444 changed immediately in consideration of cost minimisation and optimal cost. Furthermore,  
445 fluctuation of traffic volume in the future can be dealt with if the number of AADT passenger cars  
446 considerably changes. On the other hand, despite it being said maintenance cost is mainly  
447 influenced by traffic volume of large-sized cars (Link 2006), the analysis results indicated traffic  
448 volume of passenger cars had the most impact on maintenance cost.. Future work includes data  
449 collection and analysis of detailed vehicle classifications in order to improve financial strategy  
450 and structure of Tokyo expressway access fee.

451

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456

## 457 **References**

458 Atkinson, S. and Halvorsen, R. (1984) Parametric Efficiency Tests, Economies of Scale, and  
459 Input Demand in U.S. Electric Power Generation, International Economic Review 25(3):  
460 pp.647-662.

461 Bottasso, A. Conti, M. (2009) Scale economies, technology and technical change in the water  
462 industry: Evidence from the English water only sector, *Regional Science and Urban*  
463 *Economics* 39(2): pp.138-147.

464 Bilodeau, M. and Duchesne, P. (2000) Robust estimation of the SUR model, *The Canadian*  
465 *Journal of Statistics* 28(2): pp.277-288.

466 Christensen, L., Jorgenson, D. and Lau, L. (1973) Transcendental Logarithmic Production  
467 Frontiers, *The Review of Economics and Statistics* 55(1): pp.28-45.

468 Clark, J. and Speaker, P. (1994) Economies of scale and scope in banking: evidence from a  
469 generalized translog cost function, *Quarterly Journal of Business and Economics* 33(2):  
470 pp.3-25.

471 Coelli, T (1995) Recent developments in frontier modelling and efficiency measurement,  
472 *Australian Journal of Agricultural Economics* 39(3): pp.219-245.

473 Deller, S., Chicoine, D. and Walzer, N. (1988) Economies of Size and Scope in Rural Low-  
474 Volume Roads, *The Review of Economics and Statistics* 70(3): pp.459-465.

475 Fare, R., Grosskopf, S. and Pasurka, C. (2007) Environmental production functions and  
476 environmental directional distance functions, *Energy* 32: pp.1055–1066.

477 Feigenbaum, S. and Teeple, R. (1983) Public Versus Private Water Delivery: A Hedonic Cost  
478 Approach, *The Review of Economics and Statistics* 65(4): pp.672-678.

479 Ferrier, G. and Lovell, C. (1990) Measuring cost efficiency in banking Econometric and Linear  
480 Programming Evidence, *Journal of Econometrics* 46: pp.229-245.

481 Ford, J. and Warford, J. (1969) Cost functions for the water industry, *The Journal of Industrial*  
482 *Economics* 18(1): pp.53-63.

483 Heath, R. (1995) The Kobe earthquake: some realities of strategic management of crises and  
484 disasters, *Disaster Prevention and Management: An International Journal* 4(5): pp.11-24.

485 Japan Meteorological Agency (2018) Earthquake Information [online]. Available at:  
486 <https://www.jma.go.jp/jma/indexe.html> [Accessed 18 August 2018]

487 Kim, H. (1987) Economies of Scale in Multi-Product Firms: An Empirical Analysis, *Economica*  
488 *New Series* 54(214): pp.185-206.

489 Link, H. (2005) An econometric analysis of motorway renewal costs in Germany, *Transportation*  
490 *Research Part A* (40): pp.19–34.

491 Link, H. (2014) A cost function approach for measuring the marginal cost of road maintenance,  
492 Journal of Transport Economics and Policy 48(1): pp.15–33.

493 Mann, P. and Mikesell, J. (1976) Ownership and water system operation, Water Resources  
494 Bulletin 12(5): pp.995-1004.

495 Mathworks (2018) R2018a Documentation: Feasible generalized least squares [online].  
496 Available at: <https://jp.mathworks.com/help/econ/fgls.html> [Accessed 1 August 2018]

497 Metropolitan Expressway Company Limited (2015), Company Profile 2015 [online]. Available at:  
498 [http://www.shutoko.co.jp/~media/pdf/english/about/corporate/booklet\\_profile\\_2015.pdf](http://www.shutoko.co.jp/~media/pdf/english/about/corporate/booklet_profile_2015.pdf)  
499 [Accessed 9 July 2018]

500 Metropolitan Expressway Company Limited (2017a), Company Profile 2016 [online]. Available  
501 at: [http://www.shutoko.co.jp/~Media/pdf/index/about/profile/booklet\\_profile\\_2017.pdf](http://www.shutoko.co.jp/~Media/pdf/index/about/profile/booklet_profile_2017.pdf)  
502 [Accessed 17 August 2018]

503 Metropolitan Expressway Company Limited (2017b), Inspection Procedures for structures (in  
504 Japanese)

505 Miki, C. and Sasaki, E. (2005) Fracture in Steel Bridge due to Earthquakes, Steel Structures 5:  
506 pp.133-140.

507 Morgan, W. (1977) Investor owned vs. publicly owned water agencies: an evaluation of the  
508 property rights theory of the firm, Water Resources Bulletin 13(4): pp.775-781.

509 National tax agency in Japan (2017) No.12013 Overview of depreciation [online]. Available at:  
510 <https://www.nta.go.jp/english/taxes/individual/12013.htm> [Accessed 6 August 2018].

511 Noulas, A., Ray, S. and Miller, S. (1990) Returns to Scale and Input Substitution for Large U. S.  
512 Banks, Journal of Money Credit and Banking 22(1): pp.94-108.

513 Oguchi, T., Chikaraishi, M., Iijima, M., Oka, H., Horiguchi, R., Tanabe, J. and Mohri, Y. (2016)  
514 Advanced simulation model in the region of Tokyo metropolitan urban expressway rings,  
515 23rd ITS World Congress Melbourne Australia: pp.1-11.

516 Panzar, J. and Willig, R. (1977) Economies of Scale in Multi-Output Production, The Quarterly  
517 Journal of Economics 91(3): pp.481-493.

518 Podolny, J. (1993) A Status-Based Model of Market Competition, American Journal of Sociology  
519 98(4): pp.829-872.

- 520 Pulley, L. and Braunstein, Y. (1992) A composite cost function for multiproduct firms with an  
521 application to economies of scope in banking, *The Review of Economics and Statistics*  
522 74(2): pp.221-230.
- 523 Ryan, D. and Wales, T. (1999) Imposing local concavity in the translog and generalized Leontief  
524 cost functions, *Economics Letters* 67: pp.253-260.
- 525 Shepherd, W. (1970) *Theory of Cost and Production Functions*. Princeton Press, Princeton.
- 526 Subal, K. (1997) Modeling allocative inefficiency in a translog cost function and cost share  
527 equations: An exact relationship, *Journal of Econometrics* 76 (1-2): pp.351-356.
- 528 The Japan Times (2018) 15 percent cut in traffic eyed during 2020 Tokyo Olympics [online].  
529 Available at: [https://www.japantimes.co.jp/news/2018/01/11/national/15-percent-cut-traffic-](https://www.japantimes.co.jp/news/2018/01/11/national/15-percent-cut-traffic-eyed-2020-tokyo-olympics/#.W3rZHuj0k2w)  
530 [eyed-2020-tokyo-olympics/#.W3rZHuj0k2w](https://www.japantimes.co.jp/news/2018/01/11/national/15-percent-cut-traffic-eyed-2020-tokyo-olympics/#.W3rZHuj0k2w) [Accessed 18 August 2018]
- 531 Tokyo Metropolitan Government Bureau of Construction (2018) Construction of Road [online].  
532 Available at: <http://www.kensetsu.metro.tokyo.jp/english/jigyo/road/01.html> [Accessed 3  
533 August 2018]
- 534 Urakami, T. and Parker, D. (2011) The Effects of Consolidation amongst Japanese Water  
535 Utilities: A Hedonic Cost Function Analysis, *Urban Studies* 48(13): pp.2805-2825.
- 536 Uzawa, H (1962) Production Functions with Constant Elasticities of Substitution, *The Review of*  
537 *Economic Studies* 29(4): pp.291-299.
- 538 Viton, P. (1981) A Translog Cost Function for Urban Bus Transit, *The Journal of Industrial*  
539 *Economics* 29(3): pp.287-304.
- 540 Yasuda, S. and Ogasawara, M. (2004) Studies on several countermeasures against  
541 liquefaction-induced flow and an application of a measure to existing bridges in Tokyo,  
542 *Journal of Japan Association for Earthquake Engineering* 4(3): pp.370-376.
- 543
- 544 **Figure captions**
- 545 Figure 1. The map of Metropolitan Expressway (permission obtained from Metropolitan  
546 Expressway Company Limited)
- 547 Figure 2. The bridge span focused on in the study (ground plan) (permission obtained from  
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- 549 Figure 3. The bridge span focused on in the study (cross section) (permission obtained from  
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- 551 Figure 4. Data list for parameter estimation (permission obtained from the author)

552 Figure 5. Program code for parameter estimation (permission obtained from the author)

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557 Figure 9. Own-price elasticities of labour and material factors (permission obtained from the  
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562 Figure 12. Marginal maintenance cost per meter (permission obtained from the author)

563

564 **Table captions**

565 Table 1. 4 grades of damage in inspection (permission obtained from Metropolitan Expressway  
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