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# Forest Cover Changes in North Korea Since the 1980s

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18

## 19 **Abstract**

20

21 North Korea used to have abundant forest stocks but underwent substantial deforestation and  
22 degradation of forest in recent decades. This study examined morphological changes of forest  
23 cover in North Korea between the 1980s and 2000s. Land cover data based on Landsat TM  
24 imagery were obtained as images from the Republic of Korea's Ministry of Environment. The  
25 images were processed and used for the Morphological Spatial Pattern Analysis and network  
26 analysis. MSPA classified the forest cover into morphological classes such as core, islet, bridge,  
27 perforation, edge, loop, and branch. The network analysis identified individual networks of forest,  
28 each of which represents a patch of connected forest. The results are summarized as follows: (1)  
29 Forest cover sharply decreased between the 1990s and 2000s, particularly in western provinces;  
30 (2) Morphological classes indicating forest fragmentation such as islet, branch and edge  
31 consistently increased in their fraction to the total area between the 1980s and 2000s; (3) Islet,  
32 branch and edge also increased in number during the same period; (4) Forest networks shrank in  
33 size and increased in number. Overall, the results demonstrate that deforestation and  
34 fragmentation of forest occurred simultaneously in North Korea during the time.

35 Keywords: Morphological Spatial Pattern Analysis; network analysis; deforestation;  
36 fragmentation; green infrastructure; North Korea

37

## 38 Introduction

39

40 North Korea (Democratic People's Republic of Korea) has very rugged terrain in most of the  
41 country, particularly in the north and the east. Many streams originate from the mountains and  
42 flow west- or eastward, producing some flat lands suitable for farming (Korea Institute for  
43 National Unification 2009). In 1945, it was estimated that the area under forest was about 9.7  
44 million hectares out of the land area of 12.3 million hectares (ca. 79%), but it reduced to 8.2  
45 million hectares in 1997 (Piddington 2003). A range of socio-economic factors explains the  
46 decline in forest cover in North Korea, particularly during the 1980s and the 1990s when the  
47 decline was sharp (Lee et al. 1999).

48

49 One of the most important factors is thought to be conversion of forest to farmland. Food  
50 shortage was already a problem in North Korea in the 1980s, largely due to declining agricultural  
51 productivity (Kim 2005) and stagnating economy (Park et al. 2009). One of the measures to  
52 alleviate food shortage was to expand farmland, particularly in hilly areas as terraced fields. This  
53 type of farmland is called a *darakbat* in Korean. Even though *darakbats* were built as part of a  
54 government program to expand productive farmlands, many of them were poorly built and  
55 managed, and resulted in land degradation and low productivity (Lee et al. 2005). Logging can  
56 be pointed out as another major contributor to deforestation. Energy was already in short supply  
57 in the 1980s, too (Kim 2005). Lack of energy supply reduced agricultural productivity and  
58 deepened economic hardship. People adapted to energy shortage by logging in the absence of

59 government monitoring (Park et al. 2009).

60

61 Deforestation not only reduces biomass stock and ecological integrity, but also exacerbates flood  
62 damage (Bradshaw et al. 2007). Big floods are not uncommon in North Korea, but those in 1995  
63 and 1996 were particularly devastating (Kim and Ryu 2009). The floods in July and August of  
64 1995 resulted in displacement of 5.4 million people, destruction of 330,000 hectares of  
65 agricultural land, and loss of 1.9 million tons of grains (Noland et al. 2001). The 1996 floods  
66 were less severe but occurred well before recovery from the previous year's floods. Such floods  
67 were caused by downpours with decades-long cycles but the damage was exacerbated due to  
68 environmental degradation (Kim 1999).

69

70 In general, not a lot of studies are found regarding deforestation in North Korea. Some studies  
71 examined deforestation in North Korea in terms of overall statistics (Lee et al. 1999) or for a  
72 limited area (Tang et al. 2010). However, morphological studies on land cover change are hard to  
73 find. A noticeable example of morphological studies was conducted by Zheng et al. (1997). They  
74 examined forest changes in the Changbai (*Baekdu* in Korean) Mountain Reserve located on the  
75 China-North Korea border between 1972 and 1988 to find that forest became more fragmented  
76 and smaller in size. Not only reduction but also fragmentation of forest cover can be a threat to  
77 ecological integrity and sustainability. The forest ecosystem in North Korea is inhabited by  
78 various animals, plants (mostly trees) and microorganisms (Piddington 2003), and it has been  
79 well documented that the forest ecosystem continues to decrease in size. However, it is rarely

80 documented how the forest is changing in shape. Negative effects of habitat fragmentation have  
81 been widely studied (Fahrig 2003), and we certainly think that it is happening in North Korea's  
82 forest. The definition of habitat fragmentation is diverse, but the diverse definitions imply four  
83 main effects on habitat pattern (Fahrig 2003 p. 491): (1) reduction in habitat size, (2) increase in  
84 number of habitat patches, (3) decrease in sizes of habitat patches, (4) increase in isolated  
85 patches. These four elements form a guideline on how to examine morphological changes in  
86 forest in North Korea.

87

88 The purpose of the study was to quantitatively analyze morphological changes in forest cover in  
89 North Korea between the 1980s and 2000s. The novelty of the study is that this is the first  
90 attempt, to the best of our knowledge, to analyze morphological changes in forest for the entire  
91 North Korea. During the time, North Korea had the first ever leadership change (or hereditary  
92 succession) and underwent socio-economic changes. The results from the study are expected to  
93 provide a basis for scientific research on social and ecological effects of forest fragmentation.  
94 The Materials and Methods section introduces data used and our analysis methods,  
95 Morphological Spatial Pattern Analysis (MSPA) and network analysis. Following the guideline  
96 suggested by Fahrig (2003), our analysis focused on the size, frequency, and connectivity of  
97 forest patches. We hypothesized that during the time period in North Korea forest patches  
98 generally decreased in size, increased in frequency, and isolated patches or strips of forest  
99 increased in frequency. The Results and Discussion section presents statistics and maps from the  
100 analyses, and is followed by conclusion and recommendations.

101

## 102 **Materials and Methods**

103

### 104 **Land cover data**

105

106 Land cover data as images were obtained for the years 1980, 1990, and 2000 from the Web site  
107 of the Republic of Korea's (South Korea) Ministry of Environment  
108 ([http://egis.me.go.kr/bc/largeGrdCover\\_2000.do](http://egis.me.go.kr/bc/largeGrdCover_2000.do)). Each data set was produced from the Landsat  
109 TM imagery taken for three years for the entire Korean Peninsula. The spatial resolution of the  
110 Landsat imagery is 30 m, but the land cover data maps were available at a 100-m spatial  
111 resolution. They had more than 70% accuracy for classification in the North Korean region. It  
112 should be noted that ground truthing is virtually impossible in North Korea due to political  
113 reasons. Land cover types had already been classified into urban, agricultural, grassland, forest,  
114 wetland, barren, and open water using the unsupervised classification method.

115

116 First, the portion of North Korea was clipped out from the original data sets for the three years.  
117 The land cover maps were then pre-processed to produce the binary foreground and background  
118 image files, where foreground is the land cover of interest and background is the rest. Here forest  
119 pixels constitute foreground (2 bytes) and non-forest ones background (1 byte) in the

120 terminology of MSPA used in the study. Next, the pre-processed image files were converted to  
121 8-bit TIFF files without compression in a geographic information system (GIS) environment.  
122 After the series of processes, the image files for the years 1980, 1990, and 2000 were made ready  
123 for the morphological analysis.

124

125 Fig. 1 shows the land cover in North Korea for 2000. The land cover is overlaid by provincial  
126 boundaries. Generally the eastern half of the country is heavily forested and the western half is  
127 more dominated by agricultural land. Pyongyang is the largest metropolitan area and is a special  
128 administrative district as the capital of the country.

129

### 130 **Morphological Spatial Pattern Analysis**

131

132 Morphological changes of forest cover were analyzed using the Morphological Spatial Pattern  
133 Analysis (MSPA) (Soille and Vogt 2009). MSPA is based on concepts from mathematical  
134 morphology (Soille 2003), and segments arbitrary binary patterns into a series of categories or  
135 classes representing different size, shape, and connectivity (Soille and Vogt 2009). In other  
136 words, when there is a binary raster data set (forest or foreground = 1, non-forest or background  
137 = 0), MSPA analyzes the patterns of forest (foreground) cells and categorize based on the size,  
138 shape, and connectivity of the cells. This is a useful alternative to overlaying multiple thematic  
139 layers in a GIS environment for mapping green infrastructure such as forest, because it only  
140 requires a single, binary layer (Wickham et al. 2010).



141

142 A size-parameter,  $s$ , is used as a threshold to determine the categories, and defined as  $\sqrt{a^2 + b^2}$   
143 where  $a$  and  $b$  are the distance along the horizontal and vertical axes, respectively, between any  
144 two pixels (Soille and Vogt 2009). Connectivity between pixels is defined based on one of two  
145 rules, eight-neighbors and four-neighbors. If  $s = 1$ ,  $a = 0$  and  $b = 1$  (or vice versa), it corresponds  
146 to the width of one pixel. If an eight-neighbor rule is chosen for foreground, a four-neighbor rule  
147 is applied for background, or vice versa.

148

149 MSPA has seven mutually exclusive morphological categories: core, islet, loop, bridge,  
150 perforation, edge, and branch (Soille and Vogt 2009). The definition of the categories is given in  
151 Table 1 according to Soille and Vogt (2009) and illustrated in Fig. 2. Core and islet pixels can be  
152 viewed as patches of foreground pixels, while islet pixels are not connected to any other  
153 category. Branch pixels extend out from an area of core but do not connect to another area of  
154 core. Core can be viewed as hub, and bridge is equivalent to corridor or link in the literature of  
155 ecological networks (Wickham et al. 2010). The selection of the size-parameter  $s$  affects the  
156 minimum size of core and the number of core pixels, and the relationship is non-linear  
157 (Wickham et al. 2010).

158

159 **Table 1** Definition of morphological categories.

Type	Category	Definition
Patch	Core	Foreground pixels whose distance to the background is

		greater than $s$
	Islet	Patch of foreground pixels that do not contain any core pixel
Connector	Bridge	Pixels emanating from two or more core connected components
	Loop	Pixels emanating from the same core connected component
Boundary	Perforation	Pixels whose distance to the core pixels is lower than or equal to $s$ and located within a core → inner boundary
	Edge	Pixels whose distance to the core pixels is lower than or equal to $s$ and facing background on other sides → outer boundary
	Branch	Pixels that do not belong to any of the previously defined categories

160

161 To perform MSPA, we used the GUIDOS (Graphical User Interface for the Description of image  
 162 Objects and their Shapes) program available online for free from European Commission Joint  
 163 Research Centre (<http://forest.jrc.ec.europa.eu/download/soft-ware/guidos>). We used eight-  
 164 neighbor connectivity for foreground and the size-parameter value of one. Since the spatial  
 165 resolution of the data used here is 100 m, we set the edge width at 100 m.

166

167 **Network analysis**

168

169 A network analysis was conducted on the MSPA results by employing GUIDOS. The analysis is  
 170 based on the graph-theory application (Saura and Torne 2009). A graph in the analysis is a  
 171 collection of vertices or nodes and edges or links that connect nodes. In the terminology of  
 172 GUIDOS's network analysis, nodes are cores and links are bridges, and the remaining MSPA  
 173 classes including islet, loop, perforation, edge, and branch, are neglected (Vogt 2010). Bridges

174 are connectors between different cores. A connected set of nodes and links is called a component  
175 — as an interchangeable term of the graph — in GUIDOS. Thus, a set of cores without any links  
176 (i.e. nodes only) will not be considered as a component in this study.

177

## 178 **Results and Discussion**

179

180 We present the results in the following subsections: land cover change, forest cover change,  
181 morphological changes of forest, and forest network change. The land cover change subsection  
182 presents overall statistics of all land cover types during the three decades. The forest cover  
183 change subsection presents detailed information regarding the amount of forest cover. The  
184 morphological changes of forest subsection presents the results from the MSPA, and the forest  
185 network change subsection presents those from the network analysis.

186

### 187 **Land cover change**

188

189 Table 2 shows the fraction of each land cover type for the years 1980-2000 to the entire area of  
190 North Korea. Between 1980 and 1990, forest decreased by 4 percentage points whereas  
191 agricultural fields increased by 2 percentage points. Between 1990 and 2000, forest decreased by  
192 13 percentage points whereas grassland increased by 7 percentage points and agricultural fields  
193 by 4 percentage points. Urban lands increased by up to 1 percentage point for each decade. It

194 seems forest was replaced largely with agricultural and grassland. Grassland increased a lot  
195 between 1990 and 2000, and is generally located between agriculture and forest (see Fig. 1). We  
196 speculate that it indicates degradation of forest cover. Urban lands increased about 50% each  
197 decade, but are still quite small in size.

198

199 **Table 2** Fraction of land cover types to the entire land area of North Korea

Land cover type	Year		
	1980	1990	2000
Open water	2.0%	2.1%	1.4%
Urban	1.1%	1.6%	2.6%
Barren land	0.8%	1.4%	0.4%
Wetland	0.4%	0.4%	3.0%
Grassland	4.0%	4.8%	11.6%
Forest	74.6%	70.5%	57.7%
Agricultural	16.9%	19.0%	23.2%
TOTAL	100%	100%	100%

200

201

202 **Forest cover change**

203

204 Table 3 portrays overall changes in forest in North Korea between 1980 and 2000, and suggests  
 205 that deforestation accelerated during the 1990s. From 1980 to 1990 it decreased by 5% and from  
 206 1990 and 2000 it decreased by 18%. It is generally known that the sharp deforestation in the  
 207 1990s is related to severe famine that led to the so-called ‘Arduous March’  
 208 (<http://tinyurl.com/2e7eefu>). During the same time, both urban and agricultural lands increased  
 209 (see Table 2).

210

211 **Table 3** Changes in forest cover in North Korea

Year	Total area (km <sup>2</sup> )	Forest area (km <sup>2</sup> )	Change from previous data (km <sup>2</sup> )	Percent change from previous data
1980	122,762	91,717	N/A	N/A
1990	122,762	86,678	-5,039	-5%
2000	122,762	70,858	-15,820	-18%

212

213 Fig. 3 shows fraction of forest cover in each province between 1980 and 2000. Between 1980  
 214 and 1990, forest cover fraction decreased particularly in Yanggang-do, Hamgyeongbuk-do,  
 215 Raseon-si, and Nampo-si. The first three are in the northeast and Nampo-si is on the west coast,  
 216 close to Pyongyang-si. Tang et al. (2010) report that the forest in the *Baekdu* area, located in  
 217 Yanggang-do on the border with China, continued to degrade largely due to strip logging by the  
 218 early 2000s. Between 1990 and 2000, forest cover decreased particularly in Jagang-do,  
 219 Gaeseong-si, Gangweon-do, Pyeonganbuk-do, Pyeongannam-do, Hwanghaenam-do,  
 220 Pyongyang-si, and Nampo-si. Except for Gangweon-do, all are located in the western half of the  
 221 country, which is different from the period 1980-1990. They include three urban provinces

222 (Gaeseong, Pyongyang and Nampo), and Pyeongannam-do and Hwanghaenam-do border at least  
223 two of the urban provinces respectively.

224

## 225 **Morphological changes of forest**

226

227 MSPA categories of forest in North Korea are shown in Fig. 4 for the three different years. What  
228 is noticeable between 1980 and 1990 includes a large increase in islet class in south of  
229 Pyongyang, clearing of forest in the northwestern corner of the country, and widespread  
230 conversion from core to bridge classes in the northeastern ‘arm’. Deforestation is obvious, but  
231 fragmentation was of problem as much. There is a large harbor city south of Pyongyang, called  
232 Nampo, along the long narrow inlet. The northwest corner of the country has been a long-time  
233 gateway to China and an industrial center since the early 20<sup>th</sup> century. At the same time,  
234 topography-wise, the western part of North Korea is where most of plains are located, thus a lot  
235 of agricultural fields. Considering that urban areas occupy a very small fraction of the land area,  
236 conversion to farmland is thought to have had more influence than urban and industrial  
237 development. Urban areas increased by less than 2 percentage points during 1980-2000  
238 nationwide, whereas farmland increased by 6 percentage points (Table 2). On the other hand, the  
239 northeastern ‘arm’ has very high (easily exceeding 2000 m above sea level) mountains and  
240 plateaus, and is the most remote part of the country. Therefore fragmentation in the area may be  
241 due largely to individual and local activities.

242

243 Between 1990 and 2000, a large decrease in core, bridge, and islet classes in the southwest is  
244 remarkable. Not just core shrank in size but also a lot of bridge and islet disappeared. It coincides  
245 with a large increase in agricultural land during the period. The land cover maps showed that  
246 agricultural lands substantially increased during the time in the western part of the country.  
247 Many of small cores in the southwest are surrounded by agricultural lands.

248

249 The upper panel of Fig. 5 portrays the fraction of MSPA classes to the entire country, and the  
250 lower panel portrays the changes in the fraction of the MSPA classes out of the entire forest  
251 cover. Therefore the upper panel shows absolute changes (smaller fractions meaning smaller in  
252 area) whereas the lower panel shows relative changes within forest. In the upper panel core  
253 continues to decrease whereas in the lower panel it decreased and increased during the time.  
254 Because the graphs show fractional changes, a smaller fraction of core does not necessarily mean  
255 fewer cores. The fraction of core to the entire land area decreased along with overall  
256 deforestation during the time, but its areal share within forest increased between 1990 and 2000.  
257 Both graphs show that bridge increased and then decreased. Because bridges connect cores, if  
258 cores become smaller, some core cells convert to bridge cells. The opposite trends between core  
259 and bridge in the lower panel can be explained in this way. Both core and bridge decreased  
260 absolutely during 1990-2000 (upper panel), but core increased relatively and bridge decreased  
261 (lower panel). The relative decline of bridge seems to be related to the increase in branch  
262 because bridge becomes branch when the connection to core is broken. Islet and edge continued  
263 to increase both absolutely and relatively. Increasing fractions of islet and edge suggest an  
264 increasing degree of fragmentation. Islet is unconnected to anything and too small to be core, and

265 edge increases when cores are broken or change shape.

266

267 Fig. 6 portrays the frequency of MSPA classes occurring as individual objects. Core, islet, edge,  
268 bridge and branch increased in number between 1980 and 2000. With core area continuing to  
269 decrease absolutely, the increasing number of core in the figure suggests smaller cores, a sign of  
270 defragmentation. Islet, edge, and branch both increased in size and number, strongly suggesting  
271 defragmentation. Bridge is somewhat unique. Its frequency increased along with core. With  
272 more and smaller cores, it makes sense that bridge increased in number. However, the total area  
273 of bridge decreased both absolutely and relatively between 1990 and 2000 when the frequency  
274 increased remarkably. We think this is another sign of fragmentation. With more and smaller  
275 cores, bridges increased in number, and at the same time, individual bridges became much  
276 shorter, connecting fragmented cores, or were converted to non-forest.

277

## 278 **Forest network change**

279

280 Fig. 7 portrays the changes in forest network between 1980 and 2000. In the figures, each color  
281 other than light grey represents a component. In 1980, there was a very large (blue) component  
282 covering most of the country, and several small ones mostly in the southwest. In 1990, the large  
283 blue component became more porous, revealing more light grey pixels in it, and shrank in  
284 overall size. The contraction of the blue component is very startling in 2000. It is most visible in  
285 the central and southern parts of the country. At the same time, the North Korean-Chinese border



286 region experienced substantial fragmentation. Unlike in 1980 or 1990, the border is covered with  
287 pixels other than blue, meaning small networks separated from the large blue component.

288

289 Wickham et al. (2010) said that identifying and mapping of ecological networks are a significant  
290 part of green infrastructure research, and focused on forest and wetland for their green  
291 infrastructure mapping in the United States. In North Korea, the concept of green infrastructure  
292 is premature considering its dire economic and political conditions, but it is not too early to  
293 conduct research about its green infrastructure, particularly forest, before it degrades irreparably.  
294 North Korea shares borders with South Korea and China, and forest crosses the borders. Human  
295 activity degrading forest is constrained by the border, but the negative consequences, such as  
296 increased sediment loads in streams or riverine flooding are not. The present study identified  
297 degradation of forest cover in North Korea both in terms of quantity and quality, which can be of  
298 interest both to environmental managers in South Korea and China.

299

## 300 **Conclusion and Recommendations**

301

302 We examined the changes in forest cover in North Korea between the 1980s and 2000s using the  
303 Morphological Spatial Pattern Analysis (MSPA) and network analysis. The findings are  
304 summarized as follows: (1) Forest cover sharply decreased between the 1990s and 2000s,  
305 particularly in western provinces; (2) Morphological classes indicating fragmentation such as

306 islet, branch and edge consistently increased in their fraction to the total area between the 1980s  
307 and 2000s; (3) Islet, branch and edge also increased in frequency during the same period; (4)  
308 Forest networks shrank in size and increased in number. Overall, the results demonstrate that  
309 deforestation and fragmentation of forest occurred simultaneously in North Korea during the  
310 time.

311

312 These morphological changes might have been considerably influenced by various land use  
313 practices including urbanization, agricultural land expansion, industrial development, or other  
314 activities. However, it is difficult not only to pinpoint the main causes of these changes but also  
315 to interpret how they interact with each other. Better understanding of cause and consequence  
316 relations regarding our findings is deferred to the next step in research.

317

318 Our study emphasized the importance of analyzing forest degradation in the form of  
319 fragmentation. North Korea's forest stock not only decreased in amount but also degraded  
320 resulting in poorer connectivity. Restoring forest in North Korea may require an enormous  
321 amount of resources, therefore it is important to set priority. To maximize benefit with limited  
322 resources, we think restoration efforts should focus on improving connectivity of forest, which  
323 currently receives a lot of attention in ecology and land conservation planning (Saura and Torne  
324 2009). Therefore, it is important to understand the morphological pattern of forest, and it can be  
325 done using the approaches of our study. Future studies in this topic need to extend beyond the  
326 borders with South Korea and China.

327

328 **Figure Captions**

329

330 **Fig. 1** Land cover and provincial boundaries of North Korea in year 2000, with the inset map  
331 showing neighboring South Korea and China and major cities

332 **Fig. 2** Illustration of morphological categories in MSPA (Image captured from the study results)

333 **Fig. 3** Fraction of forest cover to the entire land area by province, 1980-2000

334 **Fig. 4** Map of MSPA classes for 1980 (a), 1990 (b), and 2000 (c) and their fractions to the entire  
335 land area. The fractions may not add up to 100% due to rounding.

336 **Fig. 5** Fraction of MSPA classes to the entire country (upper panel) and to the entire forest  
337 (lower panel), 1980-2000. The information in the upper panel also appears in the **Fig. 4** legend.

338 **Fig. 6** Frequency of each MSPA class occurring as individual objects, 1980-2000

339 **Fig. 7** Map of forest network for 1980 (a), 1990 (b), and 2000 (c). Each color other than grey  
340 represents a network component.

341

342

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344

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