

Industrial clusters extracted from the trade network between Taiwan and Japan

Shunsuke OKAMOTO

Abstract:

In our globalized world today, supply chains are induced by the industrial outputs. In addition, they are cross-boundary. For example, an automobile are assembled in Japan, its intermediate (or engine) is produced in Germany, and its intermediate (or iron ore) is dug out. This supply chain is constructed as the trade network of transactions between industries. Taiwan and Japan frequently trades with each other. In the future, to foster their economic growth, it is important to arrange the environment for innovation with respect to productivity or technical collaboration. This study aims at detecting industrial clusters from industrial trade network among Taiwan and Japan. The concept of an industrial cluster is captured by the relationships between industries which have transactions with each other. Detecting current industrial clusters quantitatively, we consider what kinds of policies are effective toward industrial development or technical collaboration.

Keywords:

Multi regional input-output analysis, supply-chain, spectral clustering

1. Introduction

In our globalized world today, supply chains are induced by the industrial outputs. In addition, they are cross-boundary. For example, an automobile are assembled in Japan, its intermediate (or engine) is produced in Germany, and its intermediate (or iron ore) is dug out. This supply chain is constructed as the trade network of transactions between industries. Taiwan and Japan frequently trades with each other. Figure 1 shows the trend of international trade between Taiwan and Japan from 2010 to 2017. From the figure, we can see that international and economic connection is getting stronger. In the future, to foster their economic growth, it is important to arrange the environment for innovation with respect to productivity or technical collaboration. In other words, for our development, it is important to make a good use of our interdependence which is getting deeper.

Among academic areas of economics or management, based on the expectation for innovation or high productivity by industrial accumulation, the concept of industrial cluster is proposed (Feser et al., 2000; Porter, 2000; Kelton et al., 2008; Delgado et al., 2010). In several researches, industrial cluster is quantitatively captured as the economic relationships between industries which have transactions with each other (Kagawa et al., 2013). In these days, supply chain induced by one unit

of production is getting multinational and complicated. By quantitatively extracting sub-groups (or *cluster*) in which industries have relatively large transactions, we can understand which industries are strongly connected with each other.

Therefore, this study aims at analyzing current clusters and consider what is desired for our economic development, using the trade network between Taiwan and Japan.

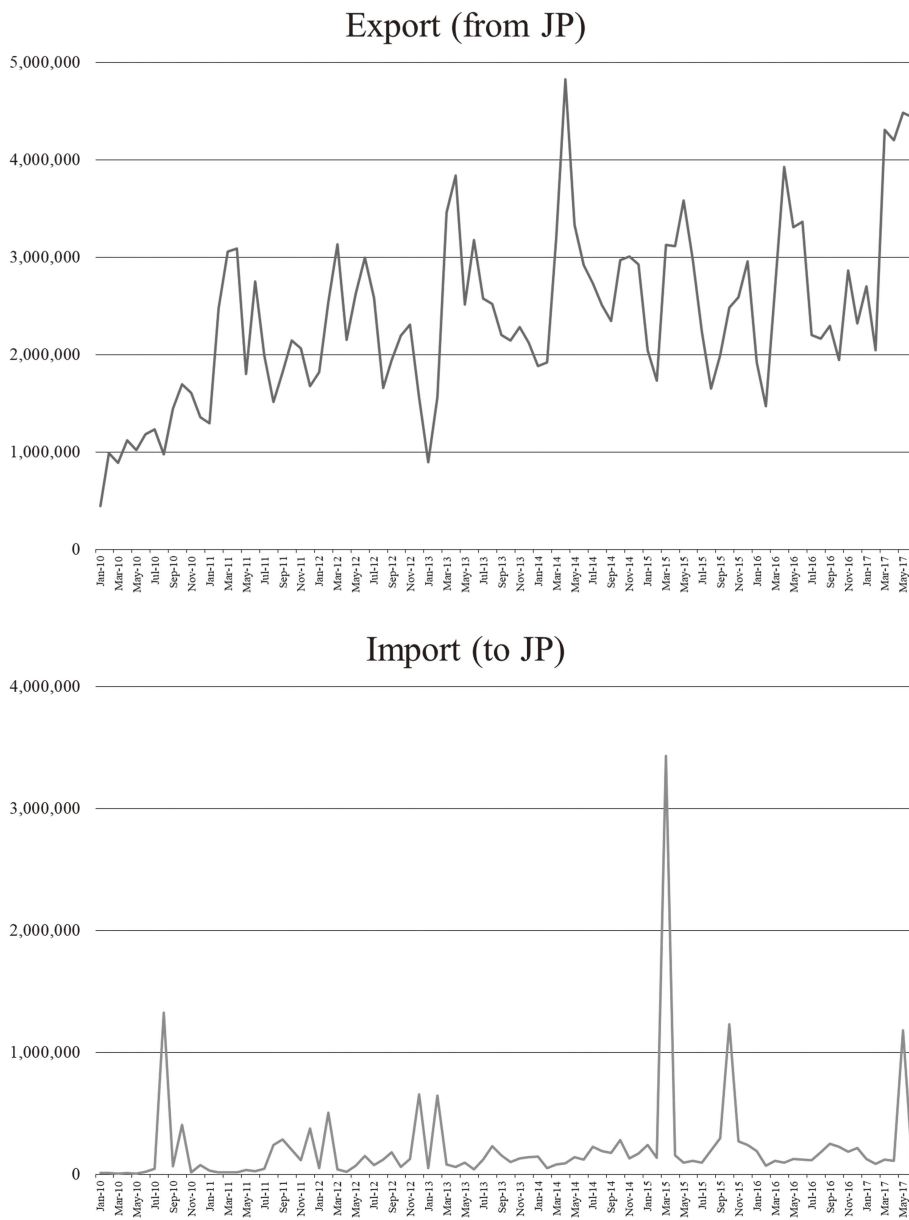


Figure 1. The trend of international trade between Taiwan and Japan from 2010 to 2017.

(Unit: 1000 JPY)

2. Methodology

2.1 Constructing trade network graph

In this paper, Input-Output table is employed for getting the information about the connection between industries (Miller and Blair, 2009). In this table, the amount of transactions between industries are described in monetary base. The intermediate matrix is described as $\mathbf{Z} = (Z_{ij})$. Here, Z_{ij} is the intermediate inputs from industry i to industry j . The large transactions are considered to be large edges between industries. This information is useful for constructing the transaction network.

Recently, Multi-Regional Input-Output tables (: MRIO) have been developed (Timmer et al., 2015). Figure 2 shows the structure of MRIO. Here, Z_{ij}^{rs} shows intermediate inputs from industry i in region r to industry j in region s , f_i^{rs} shows final demands of region s toward industry i in region r , e_i^r shows exports from industry i in region r , m_j^s shows imports to industry j in region s , v_j^s shows value added in industry j in region s , x_i^r and x_j^s shows total outputs of industry i in region r and industry j in region s respectively, n shows the number of industries, and k shows the number of regions.

Although MRIO also include national industrial transactions, they are ignored in this study to capture the trade network ($Z_{ij}^{rs} = 0(r = s)$). Then, the trade network matrix in this study is described as follows;

$$\mathbf{G} = (g_{ij}^{rs}) = \frac{\mathbf{T} + \mathbf{T}'}{2}.$$

The concept of the network is as figure 3. The broken lines are excluded. Using this trade network matrix, we could quantitatively extract industrial clusters.

| | Intermediate inputs | | | | | Final demands | | | Export | Total outputs |
|---------------------|---------------------|---------------|---------------|---------------|---------------|---------------|---------------|---------------|------------|---------------|
| Intermediate inputs | z_{11}^{11} | z_{1n}^{11} | | z_{11}^{1k} | z_{1n}^{1k} | f_{11}^{11} | | f_{11}^{1k} | e_{11}^1 | x_{11}^1 |
| | z_{n1}^{11} | z_{nn}^{11} | | z_{n1}^{1k} | z_{nn}^{1k} | f_{n1}^{11} | | f_{nn}^{1k} | e_{n1}^1 | x_{n1}^1 |
| | | | z_{ij}^{rs} | | | | f_{i1}^{rs} | | e_{i1}^r | x_{i1}^r |
| | z_{11}^{k1} | z_{1n}^{k1} | | z_{11}^{kk} | z_{1n}^{kk} | f_{11}^{k1} | | f_{11}^{kk} | e_{11}^k | x_{11}^k |
| | z_{n1}^{k1} | z_{nn}^{k1} | | z_{n1}^{kk} | z_{nn}^{kk} | f_{n1}^{k1} | | f_{nn}^{kk} | e_{n1}^k | x_{n1}^k |
| Imports | m_{11}^1 | m_{1n}^1 | m_{ij}^s | m_{11}^k | m_{1n}^k | | | | | |
| Value added | v_{11}^1 | v_{1n}^1 | v_{ij}^s | v_{11}^k | v_{1n}^k | | | | | |
| Total outputs | x_{11}^1 | x_{1n}^1 | x_{ij}^s | x_{11}^k | x_{1n}^k | | | | | |

Figure 2. The structure of MRIO framework.

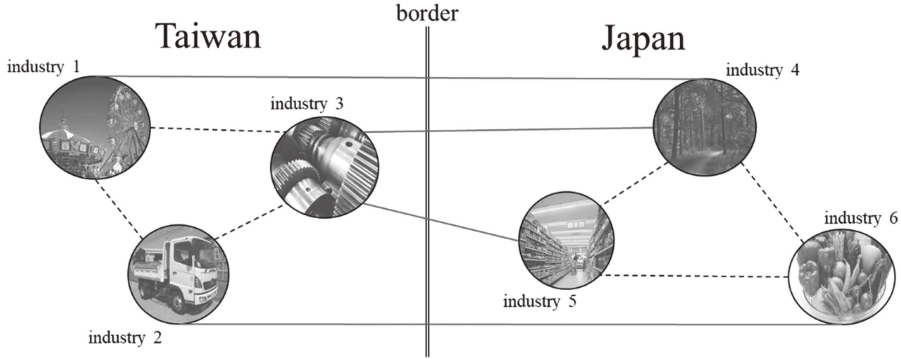


Figure 3. The concept of trade network in this study.

2.2 Extracting using spectral clustering method

From the trade network, it is difficult to intuitively define the clusters, because there are many patterns of allocation of industries. The clustering method is to extract the dense parts from network information and it has been especially developed in the area of image segmentation (Lee and Seung (1999); Shi and Malik (2000); Lee and Seung (2001)). The basic one is to reiterate dividing network into 2 parts solving eigenvalue problem (Shi and Malik (2000)). However, this method lacks the clear criterion about the number of times implemented and it tends to result in arbitrary analysis to some extent. Therefore, as overcoming method, this research employ the multiway normalized cut of spectral clustering (Ng et al. (2001); Azran and Ghahramani (2006)). Using this method, it is possible to simultaneously assign nodes to plural clusters with objective index under given number of division.

Throughout the analysis, industries and amounts of transactions are regarded as nodes and edges respectively on the context of networks. It is difficult to test all combination patterns about which industry should belong to a cluster from the network information (Bolla (2011)). Spectral clustering method tries to extract the information about to which cluster each node should belong from the resulting eigenvectors, after solving eigenvalue problem which contains network information. Eigenvectors for smaller eigenvalues could make better clustering assignment.

$Ncut$ is defined as equation (1) and the index shows how densely the nodes are collected within each cluster or how far each cluster are apart from each other (Shi and Malik (2000); von Luxburg, 2007; von Luxburg *et al.*, 2008). The smaller the value of $Ncut$ is, the better the clustering assignment would be.

$$Ncut = \sum_{y=1}^Y \frac{\sum_{i \in V_y, j \in V} g_{ij} - \sum_{i \in V_y, j \in V_y} g_{ij}}{\sum_{i \in V_y} d_i} = \sum_{y=1}^Y \frac{\mathbf{h}_y^T (\mathbf{D} - \mathbf{G}) \mathbf{h}_y}{\mathbf{h}_y^T \mathbf{D} \mathbf{h}_y} = \sum_{y=1}^Y \frac{\mathbf{h}_y^T \mathbf{D}^{\frac{1}{2}} \mathbf{D}^{-\frac{1}{2}} (\mathbf{D} - \mathbf{G}) \mathbf{D}^{-\frac{1}{2}} \mathbf{D}^{\frac{1}{2}} \mathbf{h}_y}{\mathbf{h}_y^T \mathbf{D}^{\frac{1}{2}} \mathbf{D}^{\frac{1}{2}} \mathbf{h}_y} \quad (1)$$

$$\mathbf{h}_y = (h_{iy}) = \begin{cases} 1 & (i \in V_y) \\ 0 & (i \notin V_y) \end{cases} \quad (2)$$

Here, Y is the number of clusters, V is a universal set of nodes, V_y is y^{th} cluster which consists of nodes, $d_i = \sum_{j=1}^n g_{ij}$ is degree of node i , and $\mathbf{D} = (d_i)$. \mathbf{h}_y is vector and its factor is 1 if node i belongs to V_y , otherwise 0. The role of \mathbf{h}_y is to assign nodes to clusters and it is available by solving the eigenvalue problem of $\mathbf{D}^{-\frac{1}{2}}(\mathbf{D} - \mathbf{G})\mathbf{D}^{-\frac{1}{2}}$. $(\mathbf{D} - \mathbf{G})$ is so-called Laplacian matrix. In this study, Y is set to 70, expecting that each cluster has around 10 industries. The algorithm of spectral clustering is as follows.

Algorithm

Input: The network information (: matrix $(\mathbf{D} - \mathbf{G})$)

Output: V_y ($y = 1, \dots, Y$)

- 1: Calculate $(\mathbf{D} - \mathbf{G})$ and solve the eigenvalue problem of $\mathbf{D}^{-\frac{1}{2}}(\mathbf{D} - \mathbf{G})\mathbf{D}^{-\frac{1}{2}}$.
- 2: Set the eigenvalue λ_y ($\lambda_{y-1} < \lambda_y$) and corresponding eigenvectors \mathbf{v}_y .
- 3: Prepare $\mathbf{V}_Y = [\mathbf{v}_2, \dots, \mathbf{v}_Y]$ and get $\mathbf{H}_Y = [\mathbf{h}_2, \dots, \mathbf{h}_Y]$ after applying k -means method to \mathbf{V}_Y ^{1,2}.
- 4: Get V_y ($y = 1, \dots, Y$) following \mathbf{H}_Y .

3. Data

In this study, EORA MRIO table is employed (Lenzen et al., 2012; Lenzen et al., 2013). This table covers 187 countries and totally 15909 sectors. Taiwan has 162 industrial sectors and Japan has 401 industrial sectors. In this study, the table at 2013 is employed. The industry list is shown in Appendix.

4. Results

The set of industries/areas are assigned to clusters following spectral clustering method. The number of clusters is 70. Figure 4 shows top 10 clusters according to the trade volume in clusters. Clustering list is also shown in Appendix. Red nodes are industries in Japan and blue ones are Taiwan. The thickness of lines are relevant to the transactions between industries/countries.

Figure 5 shows the cluster which is relevant to making cell phone. From this figure, it is found that semiconductor from Taiwan is essential for the production of cell phone in Japan. In addition, these transactions are also relatively large compared with the entire trade network. Figure 6 shows the cluster which is relevant to making computer components. Semiconductor' in Taiwan also links

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- 1 In case that nodes are normalized to 1, the smallest eigenvalue of Laplacian matrix is 0 and corresponding eigenvector is $\mathbf{1}$. The fact that all elements of vector are 1 is equal to the fact that all nodes belong to a single cluster. In other words, they are not divided at all. Therefore, 2nd smallest eigenvalue and corresponding eigenvector are employed for k -means method. (Meila and Shi (2001)).
 - 2 k -means method is reiteration of adjustment from initial random assignment. Therefore, the final might depend on the initial assignment to some extent. In this study, k -means method is reiterated by 100 times. The final assignment is employed following the smallest $Ncut$ from 100 results.

with other Japanese industries in other cluster. 'Semiconductor' in Taiwan also links with other Japanese industries in this cluster. We can see that although these 4 industries frequently trade their goods with each other, Japanese industries are considerably supported by 'Semiconductor' industry in Taiwan. Figure 7 shows the cluster which is relevant to making electronic precision instruments. From this figure, we could see that several industries from both countries are fully connected with each other and expect the potential for innovation or industrial accumulation for high productivity. But, for instance, 'Research and development' industries are excluded from the cluster. For mutual innovation, such an industries should be involved in the cluster.

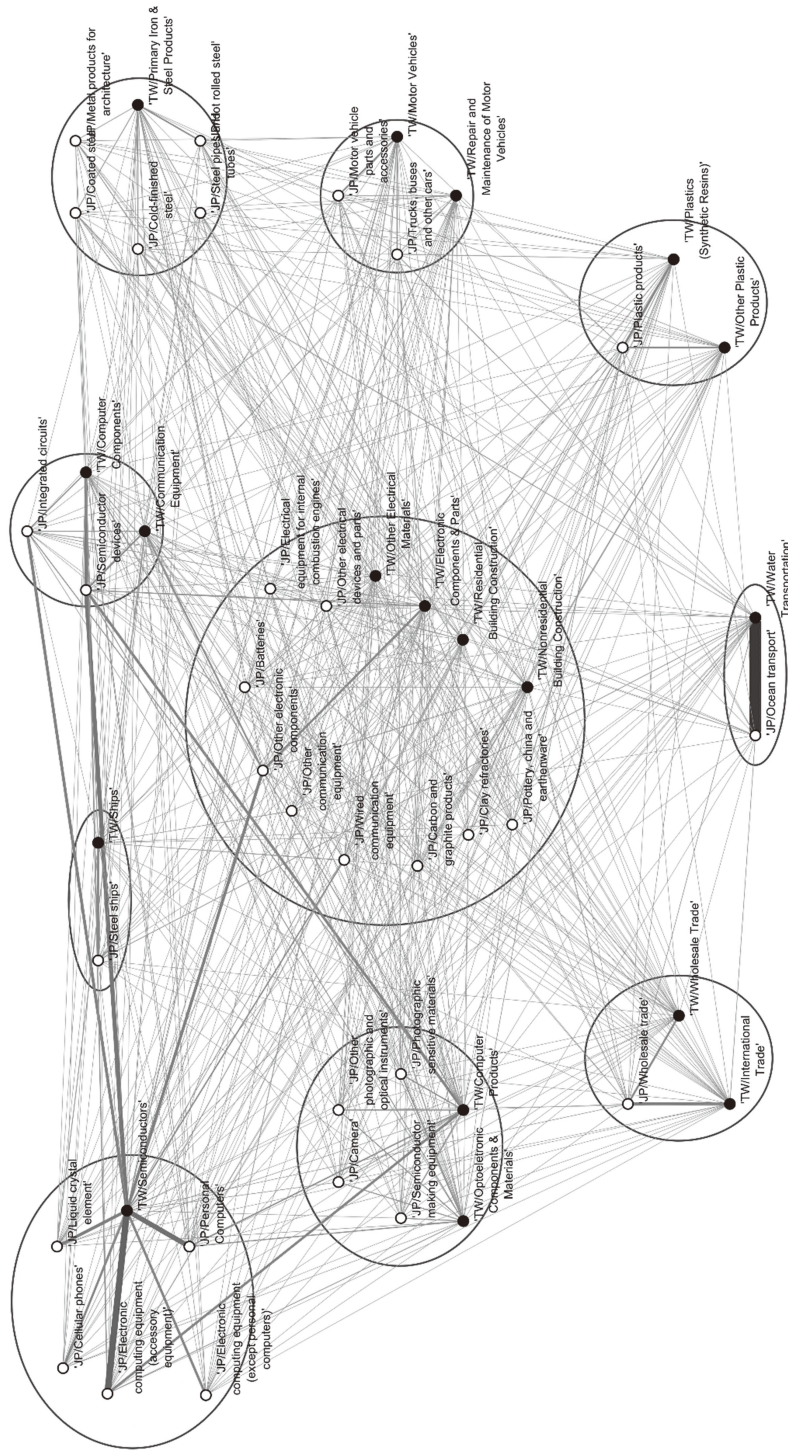


Figure 4. Relatively large clusters from the industrial trade network between Taiwan and Japan³.

³ Black rounds are industries in Taiwan.
White rounds are industries in Japan.

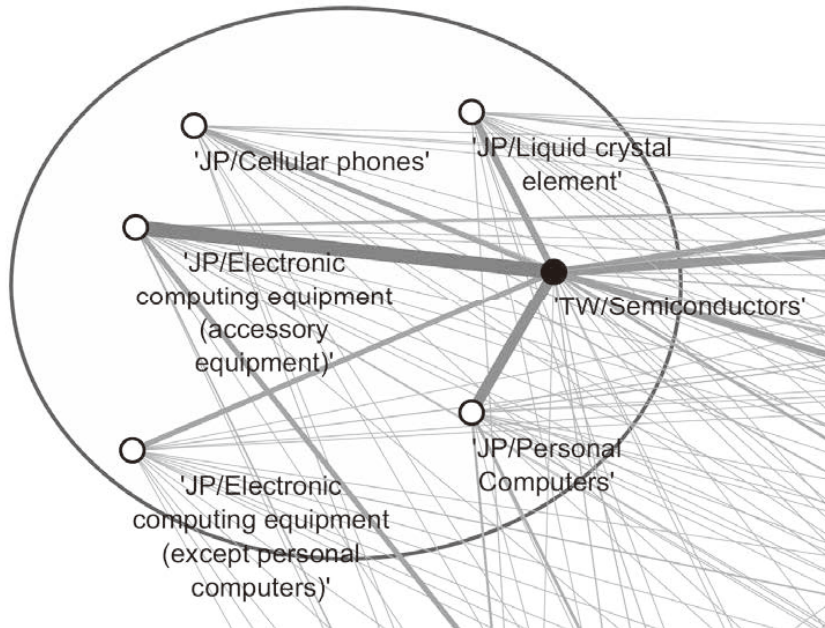


Figure 5. The cluster which is relevant to making cell phone.

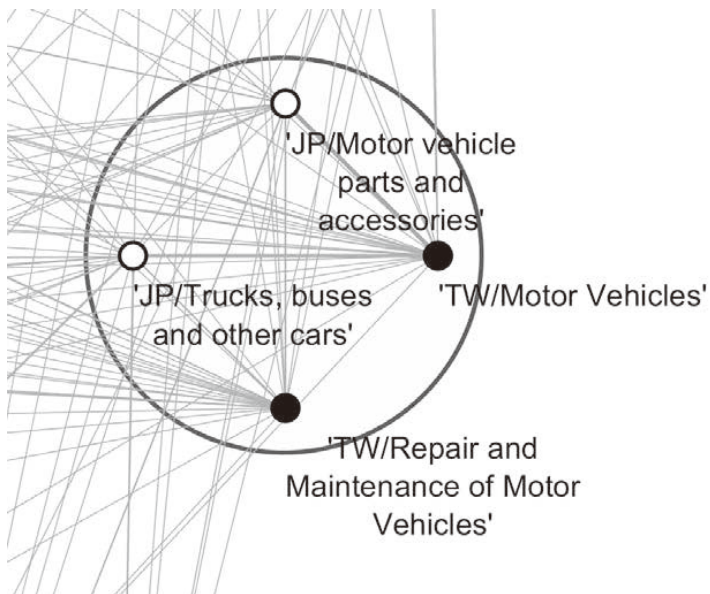


Figure 6. The cluster which is relevant to making computer components.

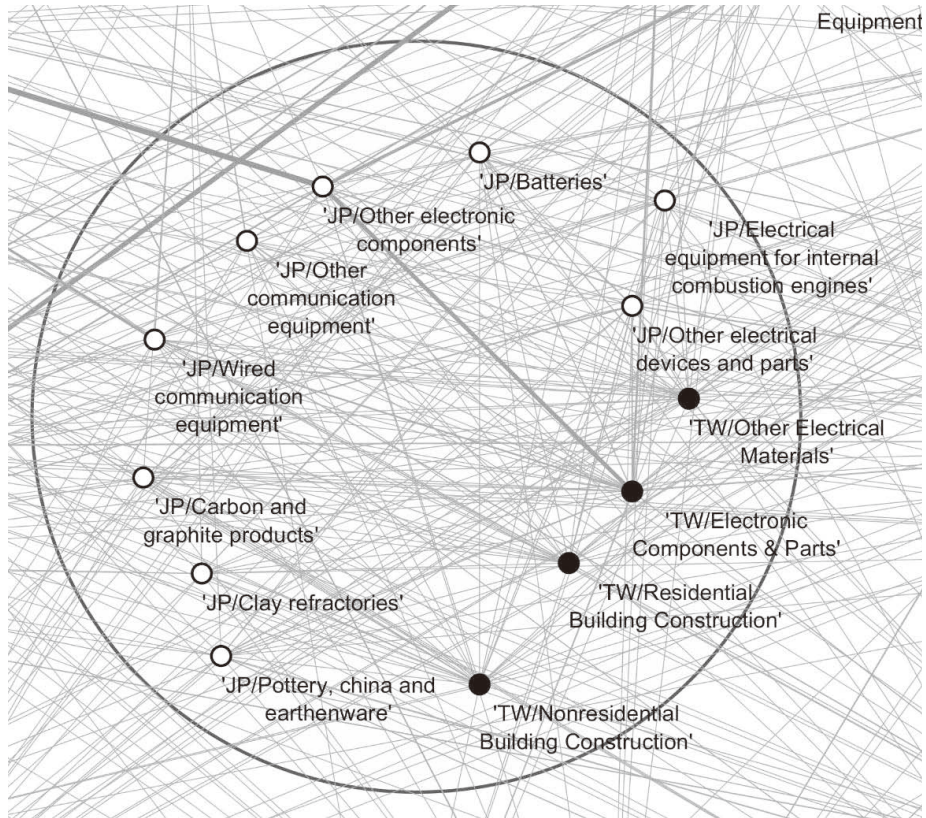


Figure 7. The cluster which is relevant to making electronic precision instruments.

5. Conclusions

This paper constructed the industrial trade network from regional input-output table, or EORA MRIO table, and quantitatively extracted the industrial clusters using spectral clustering method. Relatively large 10 clusters are found like figure 4 from the trade network which consists of 563 industries/prefectures, 401 in Japan and 162 in Taiwan respectively. The findings are as follows;

- 1) Several industrial clusters are found, including electronic precision instruments cluster, cell phone cluster, end so on.
- 2) For mutual innovation or economic development, promoting industries should be involved in the cluster, such as 'Research and development' industries, for instance.

It is expected that policy implementation like supporting industrial development could be effective when administrators from each country cooperate with each other. Applying research framework of the paper to the international technical cooperation for our future could contribute to production innovation or activating their economy after expansion of industrial infrastructure.

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Appendix

Table 1 is the industry list. Table 2 shows the clustering result.

Table 1. The industry list.

| | | | |
|----------|--|-----------|--|
| 1 Japan | Rice | 61 Japan | School lunch (private)* |
| 2 Japan | Wheat, barley and the like | 62 Japan | Other foods |
| 3 Japan | Potatoes and sweet potatoes | 63 Japan | Refined sake |
| 4 Japan | Pulses | 64 Japan | Beer |
| 5 Japan | Vegetables | 65 Japan | Whiskey and brandy |
| 6 Japan | Fruits | 66 Japan | Other liquors |
| 7 Japan | Sugar crops | 67 Japan | Tea and roasted coffee |
| 8 Japan | Crops for beverages | 68 Japan | Soft drinks |
| 9 Japan | Other edible crops | 69 Japan | Manufactured ice |
| 10 Japan | Crops for feed and forage | 70 Japan | Feeds |
| 11 Japan | Seeds and seedlings | 71 Japan | Organic fertilizers, n.e.c. |
| 12 Japan | Flowers and plants | 72 Japan | Tobacco |
| 13 Japan | Other inedible crops | 73 Japan | Fiber yarns |
| 14 Japan | Dairy cattle farming | 74 Japan | Cotton and staple fiber fabrics (inc. fabrics of synthetic spun fibers) |
| 15 Japan | Hen eggs | 75 Japan | Silk and artificial silk fabrics (inc. fabrics of synthetic filament fibers) |
| 16 Japan | Fowls and broilers | 76 Japan | Woolen fabrics, hemp fabrics and other fabrics |
| 17 Japan | Hogs | 77 Japan | Knitting fabrics |
| 18 Japan | Beef cattle | 78 Japan | Yarn and fabric dyeing and finishing (processing on commission only) |
| 19 Japan | Other livestock | 79 Japan | Ropes and nets |
| 20 Japan | Veterinary service | 80 Japan | Carpets and floor mats |
| 21 Japan | Agricultural services (except veterinary service) | 81 Japan | Fabricated textiles for medical use |
| 22 Japan | Silviculture | 82 Japan | Other fabricated textile products |
| 23 Japan | Logs | 83 Japan | Woven fabric apparel |
| 24 Japan | Special forest products (inc. hunting) | 84 Japan | Knitted apparel |
| 25 Japan | Marine fisheries | 85 Japan | Other wearing apparel and clothing accessories |
| 26 Japan | Marine culture | 86 Japan | Bedding |
| 27 Japan | Inland water fisheries and culture | 87 Japan | Other ready-made textile products |
| 28 Japan | Metallic ores | 88 Japan | Timber |
| 29 Japan | Materials for ceramics | 89 Japan | Plywood |
| 30 Japan | Gravel and quarrying | 90 Japan | Wooden chips |
| 31 Japan | Crushed stones | 91 Japan | Other wooden products |
| 32 Japan | Other non-metallic ores | 92 Japan | Wooden furniture and fixtures |
| 33 Japan | Coal mining | 93 Japan | Wooden fixtures |
| 34 Japan | Crude petroleum and natural gas | 94 Japan | Metallic furniture and fixture |
| 35 Japan | Slaughtering and meat processing | 95 Japan | Pulp |
| 36 Japan | Processed meat products | 96 Japan | Paper |
| 37 Japan | Bottled or canned meat products | 97 Japan | Paperboard |
| 38 Japan | Daily farm products | 98 Japan | Corrugated cardboard |
| 39 Japan | Frozen fish and shellfish | 99 Japan | Coated paper and building (construction) paper |
| 40 Japan | Salted, dried or smoked seafood | 100 Japan | Corrugated card board boxes |
| 41 Japan | Bottled or canned seafood | 101 Japan | Other paper containers |
| 42 Japan | Fish paste | 102 Japan | paper textile for medical use |
| 43 Japan | Other processed seafood | 103 Japan | Other pulp, paper and processed paper products |
| 44 Japan | Grain milling | 104 Japan | Newspapers |
| 45 Japan | Flour and other grain milled products | 105 Japan | Printing, plate making and book binding |
| 46 Japan | Noodles | 106 Japan | Publishing |
| 47 Japan | Bread | 107 Japan | Chemical fertilizer |
| 48 Japan | Confectionary | 108 Japan | Industrial soda chemicals |
| 49 Japan | Bottled or canned vegetables and fruits | 109 Japan | Inorganic pigment |
| 50 Japan | Preserved agricultural foodstuffs (other than bottled or canned) | 110 Japan | Compressed gas and liquefied gas |
| 51 Japan | Sugar | 111 Japan | Salt |
| 52 Japan | Starch | 112 Japan | Other industrial inorganic chemicals |
| 53 Japan | Dextrose, syrup and isomerized sugar | 113 Japan | Petrochemical basic products |
| 54 Japan | Vegetable oils and meal | 114 Japan | Petrochemical aromatic products (except synthetic resin) |
| 55 Japan | Animal oils and fats | 115 Japan | Aliphatic intermediates |
| 56 Japan | Condiments and seasonings | 116 Japan | Cyclic intermediates |
| 57 Japan | Prepared frozen foods | 117 Japan | Synthetic rubber |
| 58 Japan | Retort foods | 118 Japan | Methane derivatives |
| 59 Japan | Dishes, sushi and lunch boxes | 119 Japan | Oil and fat industrial chemicals |
| 60 Japan | School lunch (public)** | 120 Japan | Plasticizers |

Table 1. The industry list (continued).

| | | | |
|-----------|--|-----------|--|
| 121 Japan | Synthetic dyes | 181 Japan | Optical fiber cables |
| 122 Japan | Other industrial organic chemicals | 182 Japan | Rolled and drawn copper and copper alloys |
| 123 Japan | Thermo-setting resins | 183 Japan | Rolled and drawn aluminum |
| 124 Japan | Thermoplastics resins | 184 Japan | Non-ferrous metal castings and forgings |
| 125 Japan | High function resins | 185 Japan | Nuclear fuels |
| 126 Japan | Other resins | 186 Japan | Other non-ferrous metal products |
| 127 Japan | Rayon and acetate | 187 Japan | Metal products for construction |
| 128 Japan | Synthetic fibers | 188 Japan | Metal products for architecture |
| 129 Japan | Medicaments | 189 Japan | Gas and oil appliances and heating and cooking apparatus |
| 130 Japan | Soap, synthetic detergents and surface active agents | 190 Japan | Bolts, nuts, rivets and springs |
| 131 Japan | Cosmetics, toilet preparations and dentifrices | 191 Japan | Metal containers, fabricated plate and sheet metal |
| 132 Japan | Paint and varnishes | 192 Japan | Plumber's supplies, powder metallurgy products and tools |
| 133 Japan | Printing ink | 193 Japan | Other metal products |
| 134 Japan | Photographic sensitive materials | 194 Japan | Boilers |
| 135 Japan | Agricultural chemicals | 195 Japan | Turbines |
| 136 Japan | Gelatin and adhesives | 196 Japan | Engines |
| 137 Japan | Other final chemical products | 197 Japan | Conveyors |
| 138 Japan | Petroleum refinery products (inc. greases) | 198 Japan | Refrigerators and air conditioning apparatus |
| 139 Japan | Coal products | 199 Japan | Pumps and compressors |
| 140 Japan | Paving materials | 200 Japan | Machinists' precision tools |
| 141 Japan | Plastic products | 201 Japan | Other general industrial machinery and equipment |
| 142 Japan | Tires and inner tubes | 202 Japan | Machinery and equipment for construction and mining |
| 143 Japan | Rubber footwear | 203 Japan | Chemical machinery |
| 144 Japan | Plastic footwear | 204 Japan | Industrial robots |
| 145 Japan | Other rubber products | 205 Japan | Metal machine tools |
| 146 Japan | Leather footwear | 206 Japan | Metal processing machinery |
| 147 Japan | Leather and fur skins | 207 Japan | Machinery for agricultural use |
| 148 Japan | Miscellaneous leather products | 208 Japan | Textile machinery |
| 149 Japan | Sheet glass and safety glass | 209 Japan | Food processing machinery |
| 150 Japan | Glass fiber and glass fiber products, n.e.c. | 210 Japan | Semiconductor making equipment |
| 151 Japan | Other glass products | 211 Japan | Other special machinery for industrial use |
| 152 Japan | Cement | 212 Japan | Metal molds |
| 153 Japan | Ready mixed concrete | 213 Japan | Bearings |
| 154 Japan | Cement products | 214 Japan | Other general machines and parts |
| 155 Japan | Pottery, china and earthenware | 215 Japan | Copy machine |
| 156 Japan | Clay refractories | 216 Japan | Other office machines |
| 157 Japan | Other structural clay products | 217 Japan | Machinery for service industry |
| 158 Japan | Carbon and graphite products | 218 Japan | Electric audio equipment |
| 159 Japan | Abrasive | 219 Japan | Radio and television sets |
| 160 Japan | Miscellaneous ceramic, stone and clay products | 220 Japan | Video recording and playback equipment |
| 161 Japan | Pig iron | 221 Japan | Household air-conditioners |
| 162 Japan | Ferro alloys | 222 Japan | Household electric appliances (except air-conditioners) |
| 163 Japan | Crude steel (converters) | 223 Japan | Personal Computers |
| 164 Japan | Crude steel (electric furnaces) | 224 Japan | Electronic computing equipment (except personal computers) |
| 165 Japan | Steel scrap | 225 Japan | Electronic computing equipment (accessory equipment) |
| 166 Japan | Hot rolled steel | 226 Japan | Wired communication equipment |
| 167 Japan | Steel pipes and tubes | 227 Japan | Cellular phones |
| 168 Japan | Cold-finished steel | 228 Japan | Radio communication equipment (except cellular phones) |
| 169 Japan | Coated steel | 229 Japan | Other communication equipment |
| 170 Japan | Cast and forged steel | 230 Japan | Applied electronic equipment |
| 171 Japan | Cast iron pipes and tubes | 231 Japan | Electric measuring instruments |
| 172 Japan | Cast and forged materials (iron) | 232 Japan | Semiconductor devices |
| 173 Japan | Iron and steel shearing and slitting | 233 Japan | Integrated circuits |
| 174 Japan | Other iron or steel products | 234 Japan | Electron tubes |
| 175 Japan | Copper | 235 Japan | Liquid crystal element |
| 176 Japan | Lead and zinc (inc. regenerated lead) | 236 Japan | Magnetic tapes and discs |
| 177 Japan | Aluminum (inc. regenerated aluminum) | 237 Japan | Other electronic components |
| 178 Japan | Other non-ferrous metals | 238 Japan | Rotating electrical equipment |
| 179 Japan | Non-ferrous metal scrap | 239 Japan | Relay switches and switchboards |
| 180 Japan | Electric wires and cables | 240 Japan | Transformers and reactors |

Table 1. The industry list (continued).

| | | | |
|-----------|--|-----------|--|
| 241 Japan | Other industrial heavy electrical equipment | 301 Japan | Wholesale trade |
| 242 Japan | Electric lighting fixtures and apparatus | 302 Japan | Retail trade |
| 243 Japan | Batteries | 303 Japan | Financial service |
| 244 Japan | Electric bulbs | 304 Japan | Life insurance |
| 245 Japan | Wiring devices and supplies | 305 Japan | Non-life insurance |
| 246 Japan | Electrical equipment for internal combustion engines | 306 Japan | Real estate agencies and managers |
| 247 Japan | Other electrical devices and parts | 307 Japan | Real estate rental service |
| 248 Japan | Passenger motor cars | 308 Japan | House rent |
| 249 Japan | Trucks, buses and other cars | 309 Japan | House rent (imputed house rent) |
| 250 Japan | Two-wheel motor vehicles | 310 Japan | Railway transport (passengers) |
| 251 Japan | Motor vehicle bodies | 311 Japan | Railway transport (freight) |
| 252 Japan | Internal combustion engines for motor vehicles and parts | 312 Japan | Bus transport service |
| 253 Japan | Motor vehicle parts and accessories | 313 Japan | Hired car and taxi transport |
| 254 Japan | Steel ships | 314 Japan | Road freight transport |
| 255 Japan | Ships (except steel ships) | 315 Japan | Self-transport by private cars (passengers) |
| 256 Japan | Internal combustion engines for vessels | 316 Japan | Self-transport by private cars (freight) |
| 257 Japan | Repair of ships | 317 Japan | Ocean transport |
| 258 Japan | Rolling stock | 318 Japan | Coastal and inland water transport |
| 259 Japan | Repair of rolling stock | 319 Japan | Harbor transport service |
| 260 Japan | Aircrafts | 320 Japan | Air transport |
| 261 Japan | Repair of aircrafts | 321 Japan | Freight forwarding |
| 262 Japan | Bicycles | 322 Japan | Storage facility service |
| 263 Japan | Other transport equipment | 323 Japan | Packing service |
| 264 Japan | Camera | 324 Japan | Facility service for road transport |
| 265 Japan | Other photographic and optical instruments | 325 Japan | Port and water traffic control** |
| 266 Japan | Watches and clocks | 326 Japan | Services relating to water transport |
| 267 Japan | Professional and scientific instruments | 327 Japan | Airport and air traffic control (public)** |
| 268 Japan | Analytical instruments, testing machine, measuring instruments | 328 Japan | Airport and air traffic control (industrial) |
| 269 Japan | Medical instruments | 329 Japan | Services relating to air transport |
| 270 Japan | Toys and games | 330 Japan | Travel agency and other services relating to transport |
| 271 Japan | Sporting and athletic goods | 331 Japan | Postal service |
| 272 Japan | Musical instruments | 332 Japan | Fixed telecommunication |
| 273 Japan | Audio and video records, other information recording media | 333 Japan | Mobile telecommunication |
| 274 Japan | Stationary | 334 Japan | Other telecommunication |
| 275 Japan | Jewelry and adornments | 335 Japan | Other services relating to communication |
| 276 Japan | Tatami (straw matting) and straw products | 336 Japan | Public broadcasting |
| 277 Japan | Ordnance | 337 Japan | Private broadcasting |
| 278 Japan | Miscellaneous manufacturing products | 338 Japan | Cable broadcasting |
| 279 Japan | Reuse and recycling | 339 Japan | Public administration (central)** |
| 280 Japan | Residential construction (wooden) | 340 Japan | Public administration (local)** |
| 281 Japan | Residential construction (non-wooden) | 341 Japan | School education (public)** |
| 282 Japan | Non-residential construction (wooden) | 342 Japan | School education (private)** |
| 283 Japan | Non-residential construction (non-wooden) | 343 Japan | Social education (public)** |
| 284 Japan | Repair of construction | 344 Japan | Social education (private, non-profit)* |
| 285 Japan | Public construction of roads | 345 Japan | Other educational and training institutions (public)** |
| 286 Japan | Public construction of rivers, drainages and others | 346 Japan | Other educational and training institutions (profit-making) |
| 287 Japan | Agricultural public construction | 347 Japan | Research institutes for natural science (public)** |
| 288 Japan | Railway construction | 348 Japan | Research institutes for cultural and social science (public)** |
| 289 Japan | Electric power facilities construction | 349 Japan | Research institutes for natural sciences (private, non-profit)* |
| 290 Japan | Telecommunication facilities construction | 350 Japan | Research institutes for cultural and social science (private, non-profit)* |
| 291 Japan | Other civil engineering and construction | 351 Japan | Research institutes for natural sciences (profit-making) |
| 292 Japan | Electric power for enterprise use | 352 Japan | Research institutes for cultural and social science (profit-making) |
| 293 Japan | On-site power generation | 353 Japan | Research and development (intra-enterprise) |
| 294 Japan | Gas supply | 354 Japan | Medical service (public) |
| 295 Japan | Steam and hot water supply | 355 Japan | Medical service (non-profit foundations, etc.) |
| 296 Japan | Water supply | 356 Japan | Medical service (medical corporations, etc.) |
| 297 Japan | Industrial water supply | 357 Japan | Health and hygiene (public)** |
| 298 Japan | Sewage disposal** | 358 Japan | Health and hygiene (profit-making) |
| 299 Japan | Waste management services (public)** | 359 Japan | Social insurance (public)** |
| 300 Japan | Waste management services (private) | 360 Japan | Social insurance (private, non-profit)* |

Table 1. The industry list (continued).

| | | | |
|------------|--|------------|--|
| 361 Japan | Social welfare (public)** | 421 Taiwan | Rice |
| 362 Japan | Social welfare (private, non-profit)* | 422 Taiwan | Sugar |
| 363 Japan | Nursing care (In-home) | 423 Taiwan | Animal Feeds |
| 364 Japan | Nursing care (In-facility) | 424 Taiwan | Canned Foods |
| 365 Japan | Private non-profit institutions serving enterprises | 425 Taiwan | Frozen Foods |
| 366 Japan | Private non-profit institutions serving households, n.e.c.* | 426 Taiwan | Monosodium Glutamate |
| 367 Japan | Advertising services | 427 Taiwan | Other Seasonings |
| 368 Japan | Information services | 428 Taiwan | Dairy Products |
| 369 Japan | News syndicates and private detective agencies | 429 Taiwan | Sugar Confectionery & Bakery Products |
| 370 Japan | Goods rental and leasing (except car rental) | 430 Taiwan | Other Foods |
| 371 Japan | Car rental and leasing | 431 Taiwan | Non-Alcoholic Beverages |
| 372 Japan | Repair of motor vehicles | 432 Taiwan | Alcoholic Beverages |
| 373 Japan | Repair of machine | 433 Taiwan | Tobacco |
| 374 Japan | Building maintenance services | 434 Taiwan | Cotton & Cotton Fabrics |
| 375 Japan | Judicial, financial and accounting services | 435 Taiwan | Wool & Worsted Fabrics |
| 376 Japan | Civil engineering and construction services | 436 Taiwan | Artificial Fabrics |
| 377 Japan | Worker dispatching services | 437 Taiwan | Knitted Fabrics |
| 378 Japan | Other business services | 438 Taiwan | Other Fabrics |
| 379 Japan | Motion picture and video production, and distribution | 439 Taiwan | Printing, Dyeing & Finishing |
| 380 Japan | Movie theaters | 440 Taiwan | Tatted Garments |
| 381 Japan | Theater and entertainment facilities | 441 Taiwan | Knitted Garments |
| 382 Japan | Amusement and recreation facilities | 442 Taiwan | Fabric Products, Wearing Apparel & Accessories |
| 383 Japan | Stadiums and companies of bicycle, horse, motorcar and motorboat races | 443 Taiwan | Leather |
| 384 Japan | Sport facility service, public gardens and amusement parks | 444 Taiwan | Leather Footwear |
| 385 Japan | Theatrical companies | 445 Taiwan | Other Leather Products |
| 386 Japan | Other amusement and recreation services | 446 Taiwan | Lumber |
| 387 Japan | General eating and drinking places (except coffee shops) | 447 Taiwan | Plywood |
| 388 Japan | Coffee shops | 448 Taiwan | Wood, Bamboo & Rattan Products |
| 389 Japan | Eating and drinking places for pleasures | 449 Taiwan | Non-Metallic Furniture |
| 390 Japan | Hotel and other lodging places | 450 Taiwan | Pulp & Paper |
| 391 Japan | Cleaning, laundry and dyeing services | 451 Taiwan | Paper Products |
| 392 Japan | Barber shops | 452 Taiwan | Newspapers, Books & Magazines |
| 393 Japan | Beauty shops | 453 Taiwan | Other Printed Matters & Bookbinding |
| 394 Japan | Public baths | 454 Taiwan | Basic Industrial Chemicals |
| 395 Japan | Photographic studios | 455 Taiwan | Petrochemical Raw Materials |
| 396 Japan | Ceremonial occasions | 456 Taiwan | Chemical Fertilizers |
| 397 Japan | Miscellaneous repairs, n.e.c. | 457 Taiwan | Synthetic Fibers |
| 398 Japan | Places for private lessons | 458 Taiwan | Other Artificial Fibers |
| 399 Japan | Other personal services | 459 Taiwan | Plastics (Synthetic Resins) |
| 400 Japan | Office supplies | 460 Taiwan | Other Chemical Materials |
| 401 Japan | Activities not elsewhere classified | 461 Taiwan | Coatings |
| 402 Taiwan | Paddy Rice | 462 Taiwan | Medicines |
| 403 Taiwan | Coarse Grain Crops | 463 Taiwan | Pesticides and Herbicides |
| 404 Taiwan | Sugarcane | 464 Taiwan | Cleaning Preparations and Cosmetics |
| 405 Taiwan | Other Special Crops | 465 Taiwan | Other Chemical products |
| 406 Taiwan | Fruits | 466 Taiwan | Petroleum Refining Products |
| 407 Taiwan | Vegetables | 467 Taiwan | Coal Products |
| 408 Taiwan | Other Horticultural Crops | 468 Taiwan | Rubber Products |
| 409 Taiwan | Hogs | 469 Taiwan | Plastic & Rubber Footwear |
| 410 Taiwan | Other Poultry & Livestock | 470 Taiwan | Other Plastic Products |
| 411 Taiwan | Agricultural Services | 471 Taiwan | Ceramic Products |
| 412 Taiwan | Forestry | 472 Taiwan | Glass & Glass Products |
| 413 Taiwan | Fishery Products | 473 Taiwan | Cement |
| 414 Taiwan | Energy Minerals | 474 Taiwan | Cement Products |
| 415 Taiwan | Metallic Minerals | 475 Taiwan | Other Non-Metallic Mineral Products |
| 416 Taiwan | Salt | 476 Taiwan | Pig Iron & Crude Steel |
| 417 Taiwan | Other Non-Metallic Minerals | 477 Taiwan | Primary Iron & Steel Products |
| 418 Taiwan | Slaughtering & By-Products | 478 Taiwan | Aluminum |
| 419 Taiwan | Edible Oil & Fat By-Products | 479 Taiwan | Other Metals |
| 420 Taiwan | Flour | 480 Taiwan | Metal Forging & Powder Metallurgy |

Table 1. The industry list (continued).

| | | | |
|------------|---|------------|--|
| 481 Taiwan | Metallic Products for Household Use | 541 Taiwan | Real Estate Services |
| 482 Taiwan | Metallic Hand Tools | 542 Taiwan | Renting & Leasing Services |
| 483 Taiwan | Metal Structure & Architectural Components | 543 Taiwan | Legal and Accounting Services |
| 484 Taiwan | Metal Containers | 544 Taiwan | Consulting Services |
| 485 Taiwan | Other Metal Products | 545 Taiwan | Information Services |
| 486 Taiwan | Surface Treating of Metal Products | 546 Taiwan | Research & Development Services |
| 487 Taiwan | General-Purpose Industrial Machinery | 547 Taiwan | Advertising Services |
| 488 Taiwan | Metal Processing Machinery | 548 Taiwan | Other Specialized and Technologic Services |
| 489 Taiwan | Industrial Machinery | 549 Taiwan | Educational Training Services |
| 490 Taiwan | Other Machinery | 550 Taiwan | Medical & Health Services |
| 491 Taiwan | Machinery Parts, Repair & Maintenance | 551 Taiwan | Social Welfare Services |
| 492 Taiwan | Household Electrical Appliances | 552 Taiwan | Radio, Television & Movies Services |
| 493 Taiwan | Electric Lamps & Lighting Equipment | 553 Taiwan | Recreational & Cultural Services |
| 494 Taiwan | Power Generation, Transmission and Distribution Machinery | 554 Taiwan | Support Services |
| 495 Taiwan | Wires & Cables | 555 Taiwan | Environmental Sanitary Services |
| 496 Taiwan | Other Electrical Materials | 556 Taiwan | Services of Civil Association |
| 497 Taiwan | Computer Products | 557 Taiwan | Other Social Services |
| 498 Taiwan | Computer Peripheral Equipment | 558 Taiwan | Repair and Maintenance of Motor Vehicles |
| 499 Taiwan | Data Storage Media | 559 Taiwan | Other Repair Services |
| 500 Taiwan | Computer Components | 560 Taiwan | Household Services |
| 501 Taiwan | Video and Radio Electronic Products | 561 Taiwan | Other Personal Services |
| 502 Taiwan | Communication Equipment | 562 Taiwan | Public Administration Services |
| 503 Taiwan | Electronic Tubes | 563 Taiwan | Undistributed |
| 504 Taiwan | Semiconductors | | |
| 505 Taiwan | Optoelectronic Components & Materials | | |
| 506 Taiwan | Electronic Components & Parts | | |
| 507 Taiwan | Ships | | |
| 508 Taiwan | Motor Vehicles | | |
| 509 Taiwan | Motorcycles | | |
| 510 Taiwan | Bicycles | | |
| 511 Taiwan | Other Transport Equipment | | |
| 512 Taiwan | Precision Instruments & Apparatus | | |
| 513 Taiwan | Education & Entertainment Articles | | |
| 514 Taiwan | Other Manufactures | | |
| 515 Taiwan | Electricity | | |
| 516 Taiwan | Gas | | |
| 517 Taiwan | City Water, Steam & Hot Water | | |
| 518 Taiwan | Residential Building Construction | | |
| 519 Taiwan | Nonresidential Building Construction | | |
| 520 Taiwan | Public Works | | |
| 521 Taiwan | Other Construction | | |
| 522 Taiwan | Wholesale Trade | | |
| 523 Taiwan | Retail Trade | | |
| 524 Taiwan | International Trade | | |
| 525 Taiwan | Commodity Brokerage | | |
| 526 Taiwan | Hotel Services | | |
| 527 Taiwan | Restaurant Services | | |
| 528 Taiwan | Railroad Vehicle Transportation | | |
| 529 Taiwan | Other Land Transportation | | |
| 530 Taiwan | Water Transportation | | |
| 531 Taiwan | Air Transportation | | |
| 532 Taiwan | Services Incidental to Transport | | |
| 533 Taiwan | Travel Agency Services | | |
| 534 Taiwan | Warehousing | | |
| 535 Taiwan | Postal Services | | |
| 536 Taiwan | Telecommunication Services | | |
| 537 Taiwan | Finance | | |
| 538 Taiwan | Securities & Futures | | |
| 539 Taiwan | Insurance | | |
| 540 Taiwan | House Services | | |

Table 2. The clustering list.

| country | industry | country | industry |
|---------|--|---------|--|
| Japan | Wholesale trade | Japan | Pottery, china and earthenware |
| Taiwan | Wholesale Trade | Japan | Clay refractories |
| Taiwan | International Trade | Japan | Carbon and graphite products |
| Japan | Photographic sensitive materials | Japan | Wired communication equipment |
| Japan | Semiconductor making equipment | Japan | Other communication equipment |
| Japan | Camera | Japan | Other electronic components |
| Japan | Other photographic and optical instruments | Japan | Batteries |
| Taiwan | Computer Products | Japan | Electrical equipment for internal combustion engines |
| Taiwan | Optoelectronic Components & Materials | Japan | Other electrical devices and parts |
| Japan | Steel ships | Taiwan | Other Electrical Materials |
| Taiwan | Ships | Taiwan | Electronic Components & Parts |
| Japan | Semiconductor devices | Taiwan | Residential Building Construction |
| Japan | Integrated circuits | Taiwan | Nonresidential Building Construction |
| Taiwan | Computer Components | Japan | Trucks, buses and other cars |
| Taiwan | Communication Equipment | Japan | Motor vehicle parts and accessories |
| Japan | Plastic products | Taiwan | Motor Vehicles |
| Taiwan | Plastics (Synthetic Resins) | Taiwan | Repair and Maintenance of Motor Vehicles |
| Taiwan | Other Plastic Products | Japan | Ocean transport |
| Japan | Personal Computers | Taiwan | Water Transportation |
| Japan | Electronic computing equipment (except personal computers) | Japan | Hot rolled steel |
| Japan | Electronic computing equipment (accessory equipment) | Japan | Steel pipes and tubes |
| Japan | Cellular phones | Japan | Cold-finished steel |
| Japan | Liquid crystal element | Japan | Coated steel |
| Taiwan | Semiconductors | Japan | Metal products for architecture |
| | | Taiwan | Primary Iron & Steel Products |