Bayesian Network Analysis for the Questionnaire Investigation on the Needs at Fuji Shopping Street Town

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Abstract

Shopping streets at local city in Japan became old and are generally declining. In this paper, we handle the area rebirth and/or regional revitalization of shopping street. We focus on Fuji city in Japan. Four big festivals are held at Fuji city (two for Fuji Shopping Street Town and two for Yoshiwara Shopping Street Town). Many people visit these festivals including residents in that area. Therefore a questionnaire investigation to the residents and visitors is conducted during these periods in order to clarify residents and visitors' needs for the shopping street, and utilize them to the plan building of the area rebirth and/or regional revitalization of shopping street. There is a big difference between Fuji Shopping Street Town and Yoshiwara Shopping Street Town. Therefore we focus Fuji Shopping Street Town in this paper. These are analyzed by using Bayesian Network. The analysis utilizing Bayesian Network enabled us to visualize the causal relationship among items. Furthermore, sensitivity analysis brought us estimating and predicting the prospective visitors. Sensitivity analysis is performed by back propagation method. These are utilized for constructing a much more effective and useful plan building. We have obtained fruitful results. To confirm the findings by utilizing the new consecutive visiting records would be the future works to be investigated.

Keywords: Fuji city, area rebirth, regional vitalization, festival, Bayesian network, back propagation

1. Introduction

Shopping streets at local city in Japan are generally declining. It is because most of them were built in the so-called “High Growth Period (1954-1973)”. Therefore they became old and area rebirth and/or regional revitalization are required everywhere.

There are many papers published concerning area rebirth or regional revitalization. Inoue (2017) has pointed out the importance of tourism promotion. Ingu et al. (2017) developed the project of shutter art to Wakkanai Chuo shopping street in Hokkaido, Japan. Ohkubo (2017) has made a questionnaire research at Jigenji shopping street in Kagoshima Prefecture, Japan and analyzed the current condition and future issues. For about tourism, many papers are presented from many aspects as follows.

Yoshida et al. designed and conducted a visitor survey on the spot, which used a questionnaire to investigate the activities of visitors to the Ueno district in Taito ward, Tokyo. Doi et al. analyzed the image of the Izu Peninsula as a tourist destination in their 2003 study “Questionnaire Survey on the Izu Peninsula.” Kano conducted tourist behavior studies in Atami city in 2008, 2009, 2014 and in other years.

In this paper, we handle the area rebirth and/or regional revitalization of shopping street. We focus on Fuji city in Japan. Fuji city is located in Shizuoka Prefecture. Mt. Fuji is very famous all around the world and we can see its beautiful scenery from Fuji city, which is at the foot of Mt. Fuji. There are two big shopping street in Fuji city. One is Yoshiwara shopping street and another one is Fuji shopping street. They became old and building area rebirth and regional revitalization plan have started. Following investigation was conducted by the joint research group (Fuji Chamber of Commerce & Industry, Fujisan Area Management Company, Katsumata Maruyama Architects, Kougakuin University and Tokoha University). The main project activities are as follows.
Investigation on the assets which are not in active use

Questionnaire Investigation to Entrepreneur

Questionnaire Investigation to the residents and visitors

After that, area rebirth and regional revitalization plan were built.

In this paper, we handle above stated C.

Four big festivals are held at Fuji city. Two big festivals are held at Yoshiwara Shopping Street Town and two big festivals at Fuji Shopping Street Town.

At Yoshiwara Shopping Street Town, Yoshiwara Gion Festival is carried out during June and Yoshiwara Shukuba (post-town) Festival is held during October. On the other hand, Kinoene Summer Festival is conducted during August and Kinoene Autumn Festival is performed during October at Fuji Shopping Street Town. Many people visit these festivals including residents in that area.

Therefore questionnaire investigation of C is conducted during these periods.

Finally, we have obtained 982 sheets (Yoshiwara Shopping Street Town: 448, Fuji Shopping Street Town: 534).

Basic statistical analysis and Bayesian Network analysis are executed based on that.

In this paper, a questionnaire investigation is executed in order to clarify residents and visitors’ needs for the shopping street, and utilize them to the plan building of the area rebirth and/or regional revitalization of shopping street. There is a big difference between Fuji Shopping Street Town and Yoshiwara Shopping Street Town. Therefore we focus Fuji Shopping Street Town in this paper. These are analyzed by using Bayesian Network. By that model, the causal relationship is sequentially chained by the characteristics of visitors, the purpose of visiting and the image of the surrounding area at this shopping street. The analysis utilizing Bayesian Network enabled us to visualize the causal relationship among items. Furthermore, sensitivity analysis brought us estimating and predicting the prospective visitors. Sensitivity analysis was conducted by back propagation method.

Some interesting and instructive results are obtained.

The rest of the paper is organized as follows. Outline of questionnaire investigation is stated in section 2. In section 3, Bayesian Network analysis is executed which is followed by the sensitivity analysis in section 4. Remarks are stated in section 5.

2. Outline and the Basic Statistical Results of the Questionnaire Research

2.1 Outline of the Questionnaire Research

A questionnaire investigation to the residents and visitors is conducted during these periods in order to clarify residents and visitors’ needs for the shopping street, and utilize them to the plan building of the area rebirth and/or regional revitalization of shopping street. The outline of questionnaire research is as follows. Questionnaire sheet is attached in Appendix 1.

(1) Scope of investigation : Residents and visitors who have visited four big festivals at Fuji city in Shizuoka Prefecture, Japan
(2) Period : Yoshiwara Gion Festival: June 11,12/2016
Yoshiwara Shukuba (post-town) Festival: October 9/2016
Kinoene Summer Festival: August 6,7/2016
Kinoene Autumn Festival: October 15,16/2016
(3) Method : Local site, Dispatch sheet, Self-writing
(4) Collection : Number of distribution 1400
Number of collection 982(collection rate 70.1%)
Valid answer 982

2.2 Basic Statistical Results

Now, we show the main summary results by single variable.
2.2.1 Characteristics of Answers

1) Sex (Q7)
Male 43.3%, Female 56.7%
These are exhibited in Figure 1.

![Figure 1. Sex (Q7)](image1)

2) Age (Q8)
10th 20.6%, 20th 16.7%, 30th 25.3%, 40th 17.0%, 50th 10.1%, 60th 6.9%, More than 70 3.4%
These are exhibited in Figure 2.

![Figure 2. Age (Q8)](image2)

3) Residence (Q9)
a. Fuji city 82.8%, b. Fujinomiya city 8.8%, c. Numazu city 2.1%, d. Mishima city 0.7%, e. Shizuoka city 0.9%, F. Else (in Shizuoka Prefecture) 2.1%, g. Outside of Shizuoka Prefecture 2.6%
These are exhibited in Figure 3.

![Figure 3. Residence (Q9)](image3)
4) How often do you come to this shopping street? (Q1)
Everyday 21.2%, More than 1 time a week 17.2%, More than 1 time a month 22.7%,
More than 1 time a year 26.8%, First time 3.0%, Not filled in 4.1%
These are exhibited in Figure 4.

![Figure 4. How often do you come to this shopping street? (Q1)](image)

5) What is the purpose of visiting here? (Q2)
Shopping 17.2%, Eating and drinking 13.6%, Business 7.4%, Celebration, event 34.1%,
Leisure, amusement 6.1%, miscellaneous 21.6%
These are exhibited in Figure 5.

![Figure 5. What is the purpose of visiting here? (Q2)](image)

6) How do you feel about the image of the surrounding area at this shopping street? (Q3)
Beautiful 51.2%, Ugly 48.8%, of the united feeling there is 44.3%, Scattered 55.7%,
Varied 38.5%, Featureless 61.5%, New 37.1%, Historic 62.9%, Full of nature 37.1%, Urban 62.9%,
Cheerful 44.1%, Gloomy 55.9%, Individualistic 42.0%, Conventional 58.0%, Friendly 57.8%,
Unfriendly 42.2%, Healed 53.3%, Stimulated 46.7%, Open 44.8%, Exclusive 55.2%, Want to reside 43.6%,
Do not want to reside 56.4%, Warm 55.1%, Aloof 44.9%, Fascinating 42.1%, Not fascinating 57.9%,
Want to play 47.1%, Want to examine deliberately 52.9%, Lively 36.8%, Calm 63.2%,
Atmosphere of urban 28.0%, Atmosphere of rural area 72.0%
These are exhibited in Figure 6.
Figure 6. How do you feel about the image of the surrounding area at this shopping street? (Q3)

7) There are many old building at the age of nearly 50 years. Do you think we can still use them? (Q4)
Can use it 48.7%, Cannot use it 29.2%, Have no idea 22.1%
These are exhibited in Figure 7.

Figure 7. There are many old building at the age of nearly 50 years. Do you think we can still use them? (Q4)

3. Bayesian Network Analysis
In constructing Bayesian Network, it is required to check the causal relationship among groups of items.
Based on this, a model is built as is shown in Figure 8.
We used BAYONET software (http://www.msi.co.jp/BAYONET/). When plural nodes exist in the same group, it occurs that causal relationship is hard to set a priori. In that case, BAYONET system set the sequence automatically utilizing AIC standard. Node and parameter of Figure 8 are exhibited in Table 1.

Table 1. Node and parameter

| Node | Parameter   |
|------|-------------|
| 1    | Gender      |
| 2    | Male        |
| 3    | Female      |
| 4    | Age         |
| 5    | 10th        |
| 6    | 20th        |
| 7    | 30th        |
| 8    | 40th        |
| 9    | 50th        |
| 10   | 60th        |
|      | More than 70|
| 11   | The purpose of visiting |
| 12   | Shopping |
| 13   | Eating and drinking |
| 14   | Business |
| 15   | Celebration, event |
| 16   | Leisure, amusement |
| 17   | miscellaneous |
| 18   | The image of the surrounding area at this shopping street |
| 19   | Beautiful |
| 20   | Ugly |
| 21   | The image of the surrounding area at this shopping street |
| 22   | Cheerful |
| 23   | Gloomy |
| 24   | Individualistic |
| 25   | Conventional |
| 26   | Friendly |
| 27   | Unfriendly |
| 28   | Healed |
| 29   | Stimulated |
| 30   | Open |
|      | Exclusive |
| 31   | Want to reside |
| 32   | Do not want to reside |
| 33   | Warm |
| 34   | Aloof |
| 35   | Fascinating |
| 36   | Not fascinating |
| 37   | Want to play |
| 38   | Want to examine deliberately |
| 39   | Lively |
| 40   | Calm |

In the next section, sensitivity analysis is achieved by back propagation method. Back propagation method is
conducted in the following method (Figure 9).

\[
P(X = x) = \alpha \lambda(x|\pi(x)) \\
\pi(x) = \sum_y P(Y = y) \prod_y \pi_{y|x}(y) \\
\lambda(x) = \prod_y \lambda_{y|x}(x) \\
\pi_{y|x}(x) = \pi(x) \prod_{y} \lambda_{y|x}(x) \\
\lambda_{y|x}(u) = \sum_{x} \lambda(x) \prod_{y} P(Y = y) \prod_{y} \pi_{y|x}(y) 
\]

Figure 9. Back propagation method (Takeyasu, et al., 2010)

4. Sensitivity Analysis

Now, posterior probability is calculated by setting evidence as, for example, 1.0. Comparing Prior probability and Posterior probability, we can seek the change and confirm the preference or image of the surrounding area at this shopping street. We set evidence to all parameters. Therefore the analysis volume becomes too large. In this paper, we focus on “The image of the surrounding area at this shopping street” and pick up former half and make sensitivity analysis. We prepare another paper for the rest of them.

As stated above, we set evidence for each parameter, and the calculated posterior probability is exhibited in Appendix 2. The value of “Posterior probability – Prior probability” (we call this “Difference of probability” hereafter) is exhibited in Appendix 3. The sensitivity analysis is executed by mainly using this table.

Here, we classify each item by the strength of the difference of probability.

・Strong (++, --): Select major parameter of which absolute value of difference of probability is more than 0.05
・Medium (+, -=): Select major parameter of which absolute value of difference of probability is more than 0.01
・Weak: Else

In selecting items, negative value does not necessarily have distinct meaning, therefore we mainly pick up positive value in the case meaning is not clear.

Now we examine each for Strong and Medium case.

4.1 Sensitivity Analysis for “The Image of the Surrounding Area at This Shopping Street”

(1) Setting evidence to “Shopping”

After setting evidence to “Shopping”, the result is exhibited in Table 2.

Table 2. Setting evidence to “Shopping” case

| Male | Female | Age: 10th | Age: 20th | Age: 30th | Age: 50th | Age: 60th | Age: More than 70 |
|------|--------|-----------|-----------|-----------|-----------|-----------|------------------|
|      |        |           |           |           |           |           |                  |

We can observe that “Those who visit for “Shopping” had come of an age of “20th”, “60th” or “More than 70” in which the gender is “Female”.

(Strong part is indicated by bold font.)
(2) Setting evidence to “Eating and drinking”
After setting evidence to “Eating and drinking”, the result is exhibited in Table 3.

Table 3. Setting evidence to “Eating and drinking” case

|                      |   |
|----------------------|---|
| Business             | + |
| Celebration, event   | + |
| Leisure, amusement   | - |
| Of the united feeling there is | - |
| Individualistic      | - |
| Conventional         | + |
| Friendly             | - |
| Open                 | - |
| Warm                 | - |
| Fascinating          | - |
| Want to play         | - |
| Male                 | + |
| Female               | - |
| Age: 10th            | - - |
| Age: 20th            | + + |
| Age: 30th            | + + |
| Age: 40th            | - |
| Age: 50th            | + + |
| Age: 60th            | - |
| Age: More than 70    | - - |

We can observe that “Those who visit for “Eating and drinking” had come with the purpose of visiting for “Business”, ” Celebration, event” under the image of the surrounding area at this shopping street as “Conventional” of an age of “20th “, “40th “ or ”50th “ in which the gender is “Male”.

(3) Setting evidence to “Business”
After setting evidence to “Business”, the result is exhibited in Table 4.

Table 4. Setting evidence to “Business” case

|                |   |
|----------------|---|
| Eating and drinking | + |
| Celebration, event  | + |
| Leisure, amusement  | - |
| Individualistic    | - |
| Male              | + |
| Female            | - |
| Age: 10th         | - - |
| Age: 20th         | + + |
| Age: 30th         | + + |
| Age: 40th         | - |
| Age: 50th         | + |
| Age: 60th         | - |

We can observe that “Those who visit for “Business” had come with the purpose of visiting for “Eating and drinking”, “Celebration, event”of an age of “20th”, “30th” or “50th” in which the gender is “Male”.
(4) Setting evidence to “Celebration, event”
After setting evidence to “Celebration, event”, the result is exhibited in Table 5.

Table 5. Setting evidence to “Celebration, event” case

| Eating and drinking | + |
|---------------------|---|
| Business            | + |
| Leisure, amusement  | − |
| Beautiful           | − |
| Ugly                | + |
| Scattered           | + |
| Varied              | − |
| Cheerful            | − |
| Gloomy              | + |
| Individualistic     | − |
| Conventional        | + |
| Friendly            | − |
| Unfriendly          | + |
| Healed              | − |
| Open                | − |
| Exclusive           | + |
| Want to reside      | − |
| Warm                | − |
| Aloof               | + |
| Fascinating         | − |
| Not fascinating     | + |
| Want to play        | − |
| Lively              | − |
| Male                | ++ |
| Female              | − |
| Age: 10th           | − − |
| Age: 30th           | + |
| Age: 40th           | + |
| Age: 50th           | + |
| Age: 60th           | − |
| Age: More than 70   | + |

We can observe that “Those who visit for “Celebration, event” had come with the purpose of visiting for “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Ugly”, “Scattered”, “Gloomy”, “Conventional”, “Unfriendly”, “Exclusive”, “Aloof” or “Not fascinating” of an age of “30th”, “40th”, “50th” or “More than 70” in which the gender is “Male”.

(5) Setting evidence to “Leisure, amusement”
After setting evidence to “Leisure, amusement”, the result is exhibited in Table 6.
Table 6. Setting evidence to “Leisure, amusement” case

|           | Male | Female |
|-----------|------|--------|
| Age: 20th |      |        |
| Age: 40th |      |        |
| Age: 50th |      |        |
| Age: 60th |      | ++     |
| Age: More than 70 | | +     |

We can observe that “Those who visit for “Leisure, amusement” had come by an age of “60th “ or “More than 70 “in which the gender is “Female”.

4.2 Sensitivity Analysis for “Gender”

(1) Setting Evidence to “Male”

After setting evidence to “Male”, the result is exhibited in Table 7.

Table 7. Setting evidence to “Male” case

|                       | Shopping | Eating and drinking | Business | Celebration, event | Leisure, amusement | Beautiful | Ugly | Varied | New | Historic | Full of nature | Cheerful | Gloomy | Individualistic | Conventional | Friendly | Unfriendly | Want to reside | Do not want to reside | Warm | Aloof | Fascinating | Not fascinating | Want to play | Want to examine deliberately | Lively |
|-----------------------|----------|---------------------|----------|--------------------|--------------------|-----------|------|--------|-----|----------|-----------------|----------|-------|----------------|---------------|---------|------------|----------------|----------------------|-----|-------|-------------|------------------|------------|-----------------------|-------|
|                       |          |                     |          |                    |                    |           |      |        |     |         |                 |          |       |               |                |         |            |               |                      |     |       |             |                 |           |                        |       |

We can observe that “Those who are “Male” had come with the purpose of visiting for “Eating and drinking”, “Business”, or “Celebration, event” under the image of the surrounding area at this shopping street as “Ugly”, “Gloomy”, “Conventional”, “Do not want to reside”, ”Aloof” or “Not fascinating”.

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(2) Setting Evidence to “Female”
After setting evidence to “Female”, the result is exhibited in Table 8.

Table 8. Setting evidence to “Female” case

|                          |     |
|--------------------------|-----|
| Shopping                 | ++  |
| Eating and drinking      | --  |
| Business                 | --  |
| Celebration, event       | --  |
| Leisure, amusement       | ++  |
| Beautiful                | +   |
| Ugly                     | --  |
| Varied                   | +   |
| New                      | ++  |
| Historic                 | +   |
| Full of nature           | +   |
| Cheerful                 | +   |
| Gloomy                   | --  |
| Individualistic          | +   |
| Conventional             | --  |
| Friendly                 | +   |
| Unfriendly               | +   |
| Want to reside           | +   |
| Do not want to reside    | --  |
| Warm                     | ++  |
| Aloof                    | --  |
| Fascinating              | +   |
| Not fascinating          | --  |
| Want to play             | ++  |
| Want to examine deliberately | +   |
| Lively                   | +   |

We can observe that “Those who are “Female” had come with the purpose of visiting for “Shopping”, or “Leisure, amusement” under the image of the surrounding area at this shopping street as “Beautiful”, “Varied”, “New”, “Historic”, “Full of nature”, “Cheerful”, “Individualistic”, “Friendly”, “Unfriendly”, “Want to reside”, “Warm”, “Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

4.3 Sensitivity Analysis for “Age”

(1) Setting evidence to “10th”
After setting evidence to “10th”, the result is exhibited in Table 9.

Table 9. Setting evidence to “10th” case

|                          |     |
|--------------------------|-----|
| Shopping                 | --  |
| Eating and drinking      | --  |
| Business                 | --  |
| Celebration, event       | --  |
| Beautiful                | +   |
| Ugly                     | --  |
| Of the united feeling there is | ++ |
We can observe that “Those who are at the age of “10th” had come under the image of the surrounding area at this shopping street as “Beautiful”, “Of the united feeling there is”, ”Varied”, “Full of nature”, “Urban”, “Cheerful”, “Individualistic”, “Friendly”, “Healed”, “Open”, “Want to reside”, “Warm”, “Fascinating”, “Want to play” or “Lively”.

(2) Setting evidence to “20th”

After setting evidence to “20th”, the result is exhibited in Table 10.

Table 10. Setting evidence to “20th” case

| Shopping          | +  |
|-------------------|----|
| Eating and drinking | ++ |
| Business          | +  |
| Leisure, amusement| -  |
| Beautiful         | +  |
| Ugly              | -  |
| Scattered         | -  |
| Varied            | -  |
| Featureless       | -  |
| New               | +  |
| Urban             | -  |
| Cheerful          | +  |
We can observe that “Those who are at the age of “20th” had come with the purpose of visiting for “Shopping”, “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Beautiful”, “New”, “Cheerful”, “Conventional”, “Healed”, “Stimulated”, “Open”, “Want to reside”, ” Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

(3) Setting evidence to “30th”

After setting evidence to “30th”, the result is exhibited in Table 11.

Table 11. Setting evidence to “30th” case

|                     |   |
|---------------------|---|
| Shopping            |   |
| Eating and drinking | + |
| Business            | + |
| Celebration, event  | + |
| Beautiful           | + |
| Ugly                |   |
| Of the united feeling there is |   |
| Urban               |   |
| Cheerful            |   |
| Individualistic     |   |
| Conventional        | + |
| Unfriendly          |   |
| Stimulated          |   |
| Open                |   |
| Exclusive           |   |
| Want to reside      |   |
| Do not want to reside |   |
| Warm                |   |
| Aloof               |   |
| Want to play        | + |
| Want to examine deliberately |   |
| Calm                |   |

We can observe that “Those who are at the age of “20th” had come with the purpose of visiting for “Shopping”, “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Beautiful”, “New”, “Cheerful”, “Conventional”, “Healed”, “Stimulated”, “Open”, “Want to reside”, ” Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

(3) Setting evidence to “30th”

After setting evidence to “30th”, the result is exhibited in Table 11.
We can observe that “Those who are at the age of “30th” had come with the purpose of visiting for “Eating and drinking”, “Business” or “Celebration, event” under the image of the surrounding area at this shopping street as “Beautiful”, “Conventional” or “Want to play”.

(4) Setting evidence to “40th”

After setting evidence to “40th”, the result is exhibited in Table 12.

Table 12. Setting evidence to “40th” case

|                        | +  | +  |
|------------------------|----|----|
| Eating and drinking    | +  | +  |
| Business               |    |    |
| Celebration, event     | +  |    |
| Leisure, amusement     |    |    |
| Beautiful              |    |    |
| Of the united feeling there is | - |    |
| Scattered              | +  |    |
| Varied                 |    | +  |
| New                    | +  |    |
| Full of nature         | -  | -  |
| Urban                  |    |    |
| Cheerful               |    |    |
| Gloomy                 | +  |    |
| Individualistic        |    |    |
| Friendly               |    |    |
| Healed                 |    |    |
| Stimulated             |    |    |
| Open                   |    |    |
| Exclusive              | +  |    |
| Want to reside         |    |    |
| Do not want to reside  | +  |    |
| Warm                   |    |    |
| Aloof                  | +  |    |
| Fascinating            |    |    |
| Not fascinating        | +  |    |
| Lively                 |    |    |
| Calm                   | +  |    |
| Atmosphere of urban    | +  |    |
| Atmosphere of rural area | + |    |

We can observe that “Those who are at the age of “40th” had come with the purpose of visiting for “Eating and drinking” or “Celebration, event” under the image of the surrounding area at this shopping street as “Scattered”, “New”, “Gloomy”, “Exclusive”, “Do not want to reside”, “Aloof”, “Not fascinating”, “Calm”, “Atmosphere of urban” or “Atmosphere of rural area”.

(5) Setting evidence to “50th”

After setting evidence to “50th”, the result is exhibited in Table 13.
Table 13. Setting evidence to “50th” case

| Feature                  | Setting Evidence | Evidence |
|--------------------------|------------------|----------|
| Shopping                 |                  |          |
| Eating and drinking      | +                |          |
| Business                 | +                |          |
| Celebration, event       |                 | +        |
| Leisure, amusement       |                 | -        |
| Beautiful                |                 | -        |
| Ugly                     | ++               |          |
| Of the united feeling there is |                | -        |
| Scattered                |                 | +        |
| Featureless              |                 | +        |
| New                      |                 | -        |
| Full of nature           |                 | +        |
| Cheerful                 |                 | -        |
| Gloomy                   |                 | +        |
| Individualistic          |                 | +        |
| Conventional             |                 | +        |
| Friendly                 |                 | -        |
| Unfriendly               |                 | +        |
| Stimulated               |                 | +        |
| Open                     |                 | -        |
| Exclusive                |                 | +        |
| Want to reside           |                 | -        |
| Warm                     |                 | -        |
| Aloof                    |                 | +        |
| Fascinating              |                 | -        |
| Not fascinating          |                 | +        |
| Want to play             |                 | -        |
| Lively                   |                 | -        |
| Atmosphere of urban      |                 | +        |

We can observe that “Those who are at the age of “50th” had come with the purpose of visiting for “Eating and drinking”, “Business” or “Celebration, event” under the image of the surrounding area at this shopping street as “Ugly”, “Scattered”, “Featureless”, “Full of nature”, “Gloomy”, “Individualistic”, “Conventional”, “Unfriendly”, “Stimulated”, “Exclusive”, “Aloof”, “Not fascinating” or “Atmosphere of urban”.

(6) Setting evidence to “60th”

After setting evidence to “60th”, the result is exhibited in Table 14.

Table 14. Setting evidence to “60th” case

| Feature                  | Setting Evidence | Evidence |
|--------------------------|------------------|----------|
| Eating and drinking      |                  |          |
| Business                 |                  |          |
| Leisure, amusement       |                 | + +      |
| Ugly                     |                 | -        |
| Of the united feeling there is |                | -        |
| Scattered                |                 | +        |
| Varied                   |                 | -        |
| Featureless              |                 | +        |
| New                      |                 | +        |
We can observe that “Those who are at the age of “60th” had come with the purpose of visiting for “Leisure, amusement” under the image of the surrounding area at this shopping street as “Scattered”, “Featureless”, “New”, “Urban”, “Gloomy”, “Conventional”, “Unfriendly”, ”Stimulated “, “Exclusive”, “Do not want to reside”, ” Not fascinating”, “Want to examine deliberately”, “Lively”, “Calm” or “Atmosphere of rural area”.

(7) Setting evidence to “More than 70”

After setting evidence to “More than 70”, the result is exhibited in Table 15.

Table 15. Setting evidence to “More than 70” case

| Shopping            | +    |
|---------------------|------|
| Eating and drinking | -    |
| Leisure, amusement  | ++   |
| Varied              |      |
| Cheerful            | -    |
| Gloomy              | +    |
| Individualistic     | -    |
| Unfriendly          | +    |
| Healed              |      |
| Stimulated          | +    |
| Open                |      |
| Exclusive           |      |
| Do not want to reside | +  |
| Warm                |      |
| Fascinating         |      |
| Not fascinating     | +    |
| Want to play        |      |
| Want to examine deliberately | +  |
| Lively              | +    |
| Calm                | +    |
| Atmosphere of urban |      |
| Atmosphere of rural area | +    |

We can observe that “Those who are at the age of “More than 70” had come with the purpose of visiting for
“Shopping”, “Leisure, amusement” under the image of the surrounding area at this shopping street as “Gloomy”, “Unfriendly”, “Stimulated”, “Exclusive” or “Aloof”.

5. Remarks

The Results for Bayesian Network Analysis are as follows.

In the Bayesian Network Analysis, model was built under the examination of the causal relationship among items. Sensitively Analysis was conducted after that. The main result of sensitively analysis is as follows.

We can observe that “Those who visit for “Eating and drinking” had come with the purpose of visiting for “Business”, ” Celebration, event” under the image of the surrounding area at this shopping street as “Conventional” of an age of “20th”, “40th” or “50th”, in which the gender is “Male”.

We can observe that “Those who visit for “Celebration, event” had come with the purpose of visiting for “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Ugly”, “Scattered”, “Gloomy”, “Conventional”, “Unfriendly”, “Exclusive”, “Aloof” or “Not fascinating” of an age of “30th”, “40th”, “50th” or “More than 70” in which the gender is “Male”.

We can observe that “Those who are “Female” had come with the purpose of visiting for “Shopping”, or “Leisure, amusement” under the image of the surrounding area at this shopping street as “Beautiful”, “Varied”, “New”, “Historic”, “Full of nature”, “Cheerful”, “Individualistic”, “Friendly”, “Unfriendly”, “Want to reside”, “Warm”, “Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

We can observe that “Those who are at the age of “10th” had come under the image of the surrounding area at this shopping street as “Beautiful”, Of the united feeling there is”, “Varied”, “Full of nature”, “Urban”, “Cheerful”, “Individualistic”, “Friendly”, “Healed”, “Open”, “Want to reside”, “Warm”, “Fascinating”, “Want to play” or “Lively”.

We can observe that “Those who are at the age of “20th” had come with the purpose of visiting for “Shopping”, “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Beautiful”, “New”, “Cheerful”, “Conventional”, “Healed”, “Stimulated”, “Open”, “Want to reside”, ” “Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

We can observe that “Those who are at the age of “50th” had come with the purpose of visiting for “Eating and drinking”, “Business” or “Celebration, event” under the image of the surrounding area at this shopping street as “Ugly”, “Scattered”, “Featureless”, ” Full of nature”, “Gloomy”, “Individualistic”, “Conventional”, “Unfriendly”, “Stimulated”, “Exclusive”, “Aloof”, “Not fascinating” or “Atmosphere of urban”.

We can observe that “Those who are at the age of “60th” had come with the purpose of visiting for “Leisure, amusement” under the image of the surrounding area at this shopping street as “Scattered”, “Featureless”, “New”, “Urban”, “Gloomy”, “Conventional”, “Unfriendly”, ” Stimulated , “Exclusive”, “Do not want to reside”, ” Not fascinating”, “Want to examine deliberately”, ” ” “Calm” or “Atmosphere of rural area”.

6. Conclusion

Shopping streets at local city in Japan became old and are generally declining. In this paper, we handle the area rebirth and/or regional revitalization of shopping street. We focus on Fuji city in Japan. Four big festivals are held at Fuji city (two for Fuji Shopping Street Town and two for Yoshiwara Shopping Street Town). Many people visit these festivals including residents in that area. There is a big difference between Fuji Shopping Street Town and Yoshiwara Shopping Street Town. Therefore we focus Fuji Shopping Street Town in this paper. A questionnaire investigation to the residents and visitors is conducted during these periods in order to clarify residents and visitors’ needs for the shopping street, and utilize them to the plan building of the area rebirth and/or regional revitalization of shopping street. These are analyzed by using Bayesian Network. By that model, the causal relationship is sequentially chained by the characteristics of visitors, the purpose of visiting and the image of the surrounding area at this shopping street.

The Results for Bayesian Network Analysis are as follows.

In the Bayesian Network Analysis, model was built under the examination of the causal relationship among items. Sensitive Analysis was conducted after that. The main result of sensitivity analysis is as follows.

We can observe that “Those who visit for “Celebration, event” had come with the purpose of visiting for “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Ugly”, “Scattered”, “Gloomy”, “Conventional”, “Unfriendly”, “Exclusive”, “Aloof” or “Not fascinating” of an age of “30th”, “40th”, “50th” or “More than 70” in which the gender is “Male”.
We can observe that “Those who are “Female” had come with the purpose of visiting for “Shopping”, or “Leisure, amusement” under the image of the surrounding area at this shopping street as “Beautiful”, “Varied”, “New”, “Historic”, “Full of nature”, “Cheerful”, “Individualistic”, “Friendly”, “Unfriendly”, “Want to reside”, “Warm”, “Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

We can observe that “Those who are at the age of “20th” had come with the purpose of visiting for “Shopping”, “Eating and drinking”, “Business” under the image of the surrounding area at this shopping street as “Beautiful”, “New”, “Cheerful”, “Conventional”, “Healed”, “Stimulated”, “Open”, “Want to reside”, ” Fascinating”, “Want to play”, “Want to examine deliberately” or “Lively”.

The analysis utilizing Bayesian Network enabled us to visualize the causal relationship among items. Furthermore, sensitivity analysis brought us estimating and predicting the prospective visitors. Sensitivity analysis was achieved by back propagation method. These are utilized for constructing a much more effective and useful plan building.

Although it has a limitation that it is restricted in the number of research, we could obtain the fruitful results. To confirm the findings by utilizing the new consecutive visiting records would be the future works to be investigated.

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Appendix 1. Questionnaire Sheet about the Image Around the Shopping Street
1. How often do you come to this shopping street?
a. Everyday b. (  ) times a week c. (  ) times a month d. (  ) times a year
e. miscellaneous (  )
2. What is the purpose of visiting here? (Plural answers allowed)
a. shopping b. eating and drinking c. business d. celebration, event e. leisure, amusement
f. miscellaneous (  )
3. How do you feel about the image of the surrounding area at this shopping street?

Select the position

| Beautiful | Of the united feeling there is | Ugly |
|-----------|--------------------------------|------|
|           | Scattered                       |      |
| Varied    |                                |      |
| New       |                                | Historic |
| Full of nature |                            | Urban |
| Cheerful  |                                | Gloomy |
| Individualistic |                          | Conventional |
| Friendly  |                                | Unfriendly |
| Healed    |                                | Stimulated |
| Open      |                                | exclusive |
| Want to reside |                          | Do not want to reside |
| Warm      |                                | Aloof |
| Fascinating |                            | Not fascinating |
| Want to play |                          | Want to examine deliberately |
| Lively    |                                | Calm |
| Atmosphere of urban |                  | Atmosphere of rural area |

4. There are many old building at the age of nearly 50 years. Do you think we can still use them?
   a. Can use it  b. Cannot use it  C. Have no idea

5. Is there any functions or facilities that will be useful?

6. Comments

7. Sex
   a. Male b. Female

8. Age
   a. 10th  b. 20th  c. 30th  d. 40th  e. 50th  f. 60th  g. More than 70

9. Residence
   a. Fuji City  b. Fujinomiya City  c. Numazu City  d. Mishima City  e. Shizuoka City  f. Miscellaneous in Shizuoka Prefecture  
   g. Outside of Shizuoka Prefecture  [     ]
# Appendix 2. Calculated Posterior Probability

| Case 2 | Case 3 | Drug 1 | Posterior Probability | The range of the posterior probability in the changing case | Drug 2 | Posterior Probability | The range of the posterior probability in the changing case |
|--------|--------|--------|-----------------------|----------------------------------------------------------|--------|-----------------------|----------------------------------------------------------|
| Drug 1 | Drug 2 | Drug 3 |                       |                                                          |        |                       |                                                          |
| Oxygen | Water  | Alcohol | 0.21                  | 0.22                                                      | 0.23   | 0.24                  | 0.25                                                      |
|        |        |        |                       |                                                          |        |                       |                                                          |
| Air    | Water  | Alcohol | 0.21                  | 0.22                                                      | 0.23   | 0.24                  | 0.25                                                      |
|        |        |        |                       |                                                          |        |                       |                                                          |
| Alcohol | Water  | Alcohol | 0.21                  | 0.22                                                      | 0.23   | 0.24                  | 0.25                                                      |
|        |        |        |                       |                                                          |        |                       |                                                          |
## Appendix 3. Difference of Probability

| sex| race| state| The mean of probability of | The mean of the grand mean of such income level |
|---|---|---|---|---|
| ... | ... | ... | ... | ... |

### Table 1: The mean of probability of 

- **sex**: Male, Female
- **race**: White, Black, Asian, Other
- **state**: State A, State B, State C, State D

The table compares the difference of probability among various demographic groups in terms of income levels. Each entry represents the mean difference, with positive values indicating a higher probability for the listed demographic group.

### Table 2: The mean of the grand mean of such income level 

- **sex**: Male, Female
- **race**: White, Black, Asian, Other
- **state**: State A, State B, State C, State D

This table provides the grand mean of the income levels across different demographic groups. The grand mean is the average of all observed income levels, giving insight into the overall income distribution.
