Open Access

Crescent Journal of Medical and Biological Sciences Vol. 6, No. 4, October 2019, 487–493 eISSN 2148-9696

Modelling Childbearing Desire: Comparison of Logistic Regression and Classification Tree Approaches

Arezoo Bagheri¹⁰, Mahsa Saadati^{1*0}

Abstract

Objectives: According to health surveys, population growth and total fertility rate (TFR) are decreasing in Iran. The economic and social factors in addition to the changing values and attitudes in the Iranian society have had a major impact on fertility decisions and the actions of families, especially women towards childbearing. This is an important issue for policymakers and many researchers in demography and public health thus the investigation of factors that affect low TFR is considered as a necessity.

Materials and Methods: The classification and regression trees (CART) algorithm, as one of the most applicable classification trees, along with logistic regression was applied to model the tendency of 4898 women for childbearing in provinces with a TFR lower than the replacement level in Iran. The secondary data were then analysed by SPSS version 24.0.

Results: Based on these two approaches, it was concluded that despite the CART algorithm, logistic regression suffers from some shortcomings including the difficult interpretation of three levels of interactions while not containing a specific method for handling the outliers. In addition, CART results demonstrated that women's children ever born (CEB), age, and opinion had significant impacts on their desire to have a child. The groups encompassing "10-39-year-old women with CEB≤2" and "40-49-year-old women with positive attitudes towards childbearing" desired to have more children while "women with CEB ≥3" showed no tendency for childbearing.

Conclusions: In general, the results revealed that adopting policies for changing women's views on childbearing and creating the necessary resources for preventing the delays in marriage are regarded as important actions toward altering fertility rates. Another important conclusion is applying the CART algorithm as a convenient method for classifying demographical data.

Keywords: Fertility Preferences, Child, Women, Decision Trees, Logistic Regression

Introduction

Most countries in the world are currently in a state of population imbalance and are facing the consequences of this problem. Thus, demographic policies in each country can play an important role in reforming such situations (1). Like the other countries, Iran has encountered the same challenge as well. Over three decades, fertility has astonishingly reduced in Iran and the average number of children in each Iranian family has reached 1.8 (2). Since 2006, the total fertility rate (TFR) has been below the replacement level (3).

To control the fertility decline in Iran and prevent more decreases, the adoption of any action plan in this regard requires the field studies with the aim of awareness and identification of women's desires towards childbearing (4-7). Childbearing desire (CD), which is the desired number of children that families bear considering the number of their children ever born (CEB), has become an interesting issue for many researchers who study the determinants that influence fertility (1,3,5,7). Some of the most important factors that contribute to women's fertility intentions are as follows.

- The sexual composition of children (1, 8);
- Age (4,7-9);
- Marriage age (8,10,11);
- Job status (4,7,8);
- CEB (4,7,8);
- Religion (8,12);
- Residence (7);
- Income (8);
- Educational level (4,7-9);
- The ideal number of children (8);
- Abortion (8);
- Decision-making (4);
- Economic dependency (4);
- Social participation (4,12);

¹Statistical Methods and Population Modeling Department, National Population Studies and Comprehensive Management Institute, Tehran, Iran.

 $* Corresponding Author: {\tt Mahsa Saadati, Tel: +989127101985, mahsa.saadati@gmail.com, mahsa.saadati@psri.ac.ir} and the standard term of the term of term o$



Received 20 November 2017, Accepted 4 May 2018, Available online 28 May 2018

- Opinion towards childbearing, namely, its benefits against losses (7);
- Sex preference (7);
- Socioeconomic status (9).

Different statistical methods such as logistic regression and multiple regression models were applied to analyse influential factors on fertility (13-17). However, the application of some methods including data mining, which is a computational process of discovering the patterns in large data sets, has recently increased in demographical data (18-22). Logistic regression is used to analyse the relationship between a single or several predictor(s) and an outcome that is dichotomous in nature (23-25). This method has an increasing use in medical and psychological contexts in addition to its many applications for developing the models which predict the events in different scopes of sciences (26). Similar to any statistical technique, several considerations that should be taken into account when employing the logistic regression, including the task of variable selection, the occurrence of complicated interactions, and missing data handling. Among data mining methods, a decision tree has various advantages such as having simple understanding and interpretation, containing little data preparation, handling both numerical and categorical data, having the possibility of validating a model using the statistical tests, being robust, and enabling good performance with large datasets (27).

The main purpose and the novelty of this paper was to study the best model to classify CD through applying the classification tree and comparing it with logistic regression in terms of the results which were obtained from the data. For this purpose, the following section was devoted to a brief introduction of these two methods. Further, the application of both approaches on women's CD in the survey entitled "Childbearing Attitudes and its Social, Economic, and Cultural Factors" (28) was investigated in the result section, followed by presenting discussion and concluding remarks.

Materials and Methods

The classification and regression trees (CART) algorithm (29) is considered as one of the most applicable classification trees that is a non-parametric statistical method and extracts binary splits. This algorithm produces a classification tree if the dependent variable is categorical. On the other hand, it creates a regression tree when such variable is of continuous type. Furthermore, CART algorithm is performed in three phases including constructing a maximum tree, selecting the right tree size, and classifying new data (30).

In this study, logistic regression and CART classification methods were applied for modelling CD based on some selected predictors and then their results were compared by SPSS software, version 24. It is noteworthy that the developmental level of provinces has affected fertility in different studies in Iran, ignoring this difference in fertility analysis prevents the acquisition of accurate results (19). Several studies (19,20,31) considered province divisions as well. These divisions were constructed based on wholeprovince TFR in Iran, as calculated in a previous study (32) based on the own-children method during 2009-2011 (33). In the current study, the provinces of Iran were divided into TFR ≤ 2 and TFR ≥ 2 categories in order to more precisely analyse the data according to the values of TFR and replacement level. Since almost 80% of women in the survey entitled "Childbearing Attitudes and its Social, Economic, and Cultural Factors" (28) lived in provinces with a TFR less than the replacement level, logistic regression and CART algorithm were applied to the data of these provinces.

The CD of 4898 women was assessed by the question "Considering the number of children you have already had, do you desire to have another child?" Multistage stratified sampling technique was used to select the women who referred to public health and treatment centres to vaccinate their children in 31 provinces of Iran during 2014. Different factors may affect women's CD. In the present study, the selected predictors were the most influential factors that caused women to postpone childbearing and could decrease the desire for more children.

Results

Table 1 presents the descriptive statistics of the selected variables for women in provinces with a TFR \leq 2. Based on the results, approximately 63.7% of women in these provinces had CD, showing that most women had a tendency to bear children considering their CEB. Almost 14% of women were employed as well. Moreover, more than 70% of women lived in urban areas and were within the age range of 20-39 years old. Similarly, most women (36.0%) had a negative opinion toward childbearing. And the majority of them (90%) married between the ages of 10 and 29 years old. The percentage of women with high school and higher education was 66.1%, and 0.2% of them had no children. Additionally, the CEB of more than 85% of the women was 1-2 children. Finally, almost 13% of women had three or more children.

CD crossed by predicted variables is shown in Table 2. According to the results, more than 60% of women with different job statuses and residences had CD. Approximately 86.7, 74.1, and 55.6% of women, aged 10-19, 20-29, and 30-39, respectively, had a desire for childbearing while 62.2% of women aged 40-49 years old represented no willingness to have another child. Most women with different opinions toward childbearing desired to have another child and more than 60% of women in all marriage groups had a desire for childbearing. Excluding illiterate women (52.6%), the other women with different educational levels desired to have another child. Likewise, more than 60% of women who had two children

Bagheri and Saadati

Table 1. Frequency Distribution of Model Variables

| | | TFR | <2 |
|---------------------|---------------------------|-------|------|
| Variables | | No. | % |
| Childbearing desire | Yes | 3122 | 63.7 |
| (response variable) | No | 1776 | 36.3 |
| | Employed | 676 | 13.8 |
| Job status | Unemployed | 4222 | 86.2 |
| Desideres | Urban | 3517 | 71.8 |
| Residence | Rural | 1381 | 28.2 |
| | 10-19 | 128 | 2.6 |
| A == | 20-29 | 2285 | 46.7 |
| Age | 30-39 | 2120 | 43.3 |
| | 40-49 | 365 | 7.5 |
| | Negative | 1763 | 36.0 |
| Opinion | Neutral | 1557 | 31.8 |
| | Positive | 1578 | 32.2 |
| Marriago ago | 10-19 | 1790 | 36.5 |
| | 20-29 | 2830 | 57.8 |
| Marriage age | 30-39 | 271 | 5.5 |
| | 40-49 | 7 | 0.1 |
| | Illiterate | 116 | 2.4 |
| Educational loval | Primary and middle school | 1542 | 31.5 |
| Educational level | High school/Diploma | 1897 | 38.7 |
| | University | 13473 | 27.4 |
| | 0 | 8 | 0.2 |
| Children aven harm | 1-2 | 4274 | 87.3 |
| Children ever born | 3-4 | 584 | 11.9 |
| | 5+ | 32 | 0.7 |
| Total | | 4898 | 100 |

| Table 2. | Childbearing | Desire | Crossed | by | Predicted | Variable |
|----------|--------------|--------|---------|----|-----------|----------|
|----------|--------------|--------|---------|----|-----------|----------|

or less were eager to have another child. Contrarily, most women with three children or more were not interested in having any other children. Based on the results of Table 2, women's residence, age, opinion, educational level, and CEB were associated with CD whereas their job status and marriage age had no significant correlation with CD.

A binary logistic regression model was fitted to the data based on the type of dependent variable (i.e., CD). The risk of CD in provinces with TFR ≤ 2 was modelled by logistic regression on women's job status, residence, age, opinion, marriage age, educational level, and CEB. All two- and three-predictor interactions were also included in the model and analysed based on the backward method. The goodness of fit of the model was determined and confirmed by the Hosmer–Lemeshow test (*P*=0.88) and Nagelkerke's R² test (0.153). The results of the fitted model are provided in Table 3. As shown, the remaining variables in the final model had a significant effect on CD except for women's job status and CEB. None of the interactions were significant.

Urban women (i.e., women with a negative opinion), along with primary/middle school and high school/ diploma-educated women had a lower tendency to have a child in contrast to rural women (women with a positive opinion) and university-educated women. The odds of having another child in women with negative attitudes towards childbearing was 0.34 less than those with positive attitudes. In addition, the odds of CD decreased by an increase in women's age, but this ratio increased by

| Variables | | Childbearing Desire (Response Variable) | | | Test Statistic | 01/1 |
|--------------------|---------------------------|---|------|-------|------------------|---------|
| Name | Value | Yes | No | Total | - lest Statistic | P value |
| Job status | Employed | 62.6 | 37.4 | 100 | 0.460* | 0.497 |
| | Unemployed | 63.9 | 36.1 | 100 | 0.462 | |
| Decidence | Urban | 62.6 | 37.4 | 100 | 6 56* | 0.010 |
| Residence | Rural | 66.5 | 33.5 | 100 | 0.50 | |
| | 10-19 | 86.7 | 13.3 | 100 | | |
| | 20-29 | 74.1 | 25.9 | 100 | 201 27** | <0.001 |
| Age | 30-39 | 55.6 | 44.4 | 100 | 301.27 | |
| | 40-49 | 37.8 | 62.2 | 100 | | |
| | Negative | 56.0 | 44.0 | 100 | 87.41 | <0.001 |
| Opinion | Neutral | 64.7 | 35.3 | 100 | | |
| | Positive | 71.5 | 28.5 | 100 | | |
| | 10-19 | 62.0 | 38.0 | 100 | | 0.159 |
| | 20-29 | 65.0 | 35.0 | 100 | 1 00** | |
| Marriage age | 30-39 | 61.3 | 38.7 | 100 | 1.98 | |
| | 40-49 | 85.7 | 14.3 | 100 | | |
| | Illiterate | 47.4 | 52.6 | 100 | | <0.001 |
| Educational Issuel | Primary and Middle school | 59.9 | 40.1 | 100 | 20 12** | |
| Educational level | High School/diploma | 65.2 | 34.8 | 100 | 28.12 | |
| | University | 67.5 | 32.5 | 100 | | |
| | 0 | 87.5 | 12.5 | 100 | | |
| Children ever | 1-2 | 67.9 | 32.1 | 100 | 0.50 40** | 0.001 |
| born | 3-4 | 34.8 | 65.2 | 100 | 250.43 | <0.001 |
| | 5+ | 31.3 | 68.8 | 100 | | |

Note. *Pearson chi-square test; **linear-by-linear association

Table 3. CD Regressed on Predictors

| Variables | | | D)/alua | 95% Cl | | |
|--------------------|--------------------------------|-----------|-----------|--------|--|--|
| Name | Value | — Exb (B) | P Value – | Lower | Lower | |
| I-h -t-t | Employed | 1.024 | 0.814 | 0.838 | 1.252 | |
| JOD Status | Unemployed (ref.) | | | | | |
| Desidence | Urban | 0.710 | 0.000** | 0.611 | 0.824 | |
| Residence | Rural (ref.) | | | | er Lower 18 1.252 1 0.824 21 49.042 39 6.322 10 2.128 28 0.584 50 1.101 09 0.638 11 0.851 15 1.144 53 1.063 14 0.883 | |
| | 10-19 | 14.216 | 0.000** | 4.121 | 49.042 | |
| Ago | 20-29 | 4.123 | 0.000** | 2.689 | 6.322 | |
| Age | 30-39 | 1.414 | 0.096 | 0.940 | 2.128 | |
| | 40-49 (ref.) | | 0.090 | | | |
| | Negative | 0.340 | 0.000** | 0.198 | 0.584 | |
| Opinion | Neutral | 0.630 | 0.105 | 0.360 | 1.101 | |
| | Positive (ref.) | | 0.105 | | | |
| | 10-19 | 0.074 | 0.018* | 0.009 | 0.638 | |
| N 4 | 20-29 | 0.098 | 0.035* | 0.011 | 0.851 | |
| Marriage age | 30-39 | 0.131 | 0.066 | 0.015 | 1.144 | |
| | 40-49 (ref.) | | | | | |
| | Illiterate | 0.694 | 0.093 | 0.453 | 1.063 | |
| Educational level | Primary/Middle school | 0.736 | 0.001** | 0.614 | 0.883 | |
| | High school/diploma University | 0.814 | 0.014* | 0.691 | 0.959 | |
| | 0 | 44.3 | 0.143 | 0.562 | 52.675 | |
| | 1-2 | 2.019 | 0.095 | 0.885 | 4.604 | |
| Children ever born | 3-4 | 0.815 | 0.631 | 0.355 | 1.874 | |
| | 5* | | | | | |

*Significance at the 0.05 level; **Significance at the 0.01 level.

increasing women's marriage age.

Figure 1 illustrates the classification trees of CD in provinces with TFR ≤ 2 . Based on the data, rules 1-3 were extracted from the intended classification tree as follows. 1. The 10-39-year-old women with 2 children or less had a desire for more children;

2. The 40-49-year-old women with 2 children or less and those with negative and neutral opinions as compared to women a positive opinion toward childbearing were not willing to have more children;

3. Those with three children or more showed no willingness to have more children.

The accuracy of the classification tree of CD in provinces with TFR ≤ 2 (Figure 1) is 0.68 according to the misclassification matrix. This means that the CD of 68% of women was classified correctly. Based on this value, the misclassification of this model is 32%.

Likewise, Table 4 shows the risks and standard errors of classification trees, which are calculated based on training and learning data. When the risk of these two data groups is close to each other, it confirms the validity of the fitted models (30). Based on the results of Table 4, these values are almost equal, indicating the validity of the classification model which was proposed by the classification tree in Figure 1.

Misclassification matrices were used for logistic

regression and CART algorithm in order to compare these approaches. Table 5 represents the above-mentioned matrix in which the shaded cells signify the correct classification or the accuracy of both models. According to this table, the accuracy of these models, which was computed in equations 1 and 2, demonstrated no significant differences.

Accuracy of CART model =
$$\frac{2856 + 489}{4898} = 0.68$$
 (1)

Accuracy of Logistic regression =
$$\frac{2848 + 508}{4898} = 0.685$$
 (2)

The comparison of the results of both methods on CD revealed that the CART algorithm had specific divisions based on variables like women's CEB, age, and opinion. This indicates the presence of significant interactions among these predictors in logistic regression although none of the interactions were significant in this model. Thus, the CART algorithm had a smaller division in the data set, which could result in significant splits as compared to logistic regression results.

The predictor interactions were not significant in the fitted logistic regression in this study although it is important to mention that the interpretation of these interactions with more than three levels would be difficult even if they were significant. However, this task is one of



Figure 1. Classification Tree of Childbearing Desire.

the vital benefits of applying the CART algorithm on data sets.

The continuity of low fertility is undesirable for any population. Given the consequences of the continued fertility below the replacement level, adopting programmes to prevent the continuity of fertility reduction while increasing fertility at least to the replacement level is of great necessity. Moreover, any policy for increasing fertility rate or preventing its further reduction requires

Table 4. Risks and Standard Errors of Classification Trees

| | TFR≤2 | | |
|---------------------------------------|-------|----------------|--|
| | Risk | Standard error | |
| Learning set | 0.317 | 0.007 | |
| k-fold cross validity of training set | 0.325 | 0.007 | |

Table 5. Misclassification Matrix for Classification Trees and Logistic Regression

understanding the factors and conditions that affect fertility (1).

Discussion

The present study mainly aimed at applying CART algorithm to classify women's CD and compare the results of the fitted model with those of logistic regression. Since most of the women in the Shahla's survey (28) lived in provinces with a TFR less than the replacement level, these women's CD was considered for further investigation. Based on the results, almost 70% of women with one child or more had CD while the majority of those women with more than two children were not willing to have any other child (Table 2). According to the results of the accuracy (almost 68%), there were no significant differences between logistic regression and CART algorithm regarding analysing these data. By considering predictor

| | | CART | | | Logistic Regression | | | |
|-------------------|------------------|--------------------|-------|-------|---------------------|-------|-------|--|
| Observed Category | | Predicted Category | | Total | Predicted Category | | Total | |
| | | Yes | No | | Yes | No | | |
| Yes | Numbers | 2856 | 266 | 3122 | 2848 | 274 | 3122 | |
| | Total Percentage | 58.32 | 5.42 | 63.74 | 58.15 | 5.59 | 63.74 | |
| No | Numbers | 1287 | 489 | 1776 | 1268 | 508 | 1776 | |
| | Total Percentage | 26.28 | 9.98 | 36.26 | 25.89 | 10.37 | 36.26 | |
| | Total | 4143 | 755 | 4898 | 4116 | 782 | 4898 | |
| | Total Percentage | 84.59 | 15.41 | 100 | 84.03 | 15.97 | 100 | |

CART: Classification and regression tree.

interactions, CART could divide more precise splits compared to logistic regression for these data. However, none of these interactions were significant in logistic regression. Even if such interactions were significant, they would not be easy to interpret (15-17), especially in threeterm interactions such as women's CEB, age, and opinion. The findings of some studies on medical data confirmed the results of this study, which indicate the superiority of the CART algorithm in this regard (22, 26, 34-36).

The results of the CART algorithm (Figure 1) indicated that CEB was the most influential factor on CD. Thus, the tendency towards childbearing decreased by increasing the number of CEB, which is in line with the results of several other studies (1,4,6,7,37).

More importantly, women's age also played a significant role in CD. In this study, most of the women with lower CEB (2 children or less) and older age (40-49 years old) had no tendency toward childbearing. Moreover, most women with higher CEB (three or more children) and older age (30-49 years old) wanted no other child. These results confirm the influential role of women's age in CEB. Other studies obtained similar results about women's age as well (4,7,9). For example, they found that the desire to have more children reduces when women get older. Saadati and Bagheri indicated that younger women will have at least two children if their socio-economic conditions change according to their needs (38). The unwillingness of older women could also be due to the decreasing ability of women to bear children at these ages (38).

Based on the findings of this study, the opinion regarding cultural, economic, and social variables also somewhat affected the decline in women's desires. Women aged 40-49 with 2 children or less and negative and neutral opinions were less likely to have another child as compared to those with positive opinions toward childbearing, which corroborates with the findings of similar results (7,39). Women's negative opinions could cause a decrease in their willingness to have more children, including a reduced sense of happiness with the presence of the child, blame from others when having more children, the high cost of childbearing, and considering children as a barrier to their work and education progress.

Considering that the most influential variables in women's willingness for having a child encompassed the number of CEB, along with their age and opinion toward childbearing, policymakers should help strengthen women's positive opinion in this regard and promote marriage at younger ages in order to provide suitable time for them to reach their ideal number of children.

Further, CART was utilized to produce the classification trees of CD in this study because it is a distributionfree (non-parametric) algorithm which is robust against outliers and collinearities and can employ both categorical and continuous variables. Finally, this model can encounter the missing data and detect the interactions and is considered as an exploratory analysis (22, 29).

Conflict of Interests

Authors have no conflict of interests.

Ethical Issues

Not applicable.

Financial Support

This study was extracted from a survey entitled "Mining Demographic Data by Decision Tree," which was supported by the National Population Studies and Comprehensive Management Institute in 2014 with the registered number 20/15283.

References

- Tavousi M, Motlagh ME, Eslami M, Haerimehrizi AA, Hashemi A, Montazeri A. Fertility desire and its correlates: a pilot study among married citizens living in Tehran, Iran. Payesh. 2015;14(5):597-605. [Persian].
- Abbasi-Shavazi MJ, Lutz W, Hosseini-Chavoshi M, KC S. Education and the world's most rapid fertility decline in Iran. Laxenburg, Austria: International Institute for Applied Systems Analysis; 2008.
- 3. Kaboudi M, Ramezankhani A, Manouchehri H, Hajizadeh E, Haghi M. The decision-making process of childbearing: a qualitative study. Payesh. 2013;12(5):505-515. [Persian].
- Abbasi-Shavazi MJ, Khajeh Salehi Z. An assessment on the impact of women's autonomy, education and social participation on childbearing intention in Sirjan city. Woman in Development and Politics. 2013;11(1):45-65. [Persian].
- Asghari M. The Study of fertility behavior, intentions and ideals among married women aged 15-49 in Dehloran. Hamedan: Faculty of Economics and Social Sciences, Bu-Ali Sina University; 2012.
- Hosseini H, Torabi F, Bagi B. Demand for long-acting and permanent contraceptive methods among Kurdish women in Mahabad, Iran. J Biosoc Sci. 2014;46(6):772-785. doi:10.1017/s0021932013000710
- Hosseini H, Bagi B. Women's autonomy and fertility ideals among Kurdish women in the City of Mahabad. Woman in Development and Politics. 2013;10(4):57-78. [Persian].
- 8. Preeti, Singh LL. Time varying and unvarying factors affecting ideal and actual family size in North India. Dallas, Texas: Annual Meeting Program Population Association of America Princeton University; 2010.
- Hejazi NS. Women's attitude to having second child and factors effecting on it. Journal of Health System Research. 2013;9(7)771-781. [Persian].
- Taghizadeh Z, Vedadhir A, Behmanesh F, Ebadi A, Pourreza A, Abbasi-Shavazi MJ. Reproductive practices by patterns of marriage among Iranian women: study protocol for an explanatory sequential mixed methods design. Reprod Health. 2015;12:89. doi:10.1186/s12978-015-0080-1
- 11. Taghizadeh Z, Behmanesh F, Ebadi A. Marriage patterns and childbearing: results from a quantitative study in north of Iran. Glob J Health Sci. 2015;8(3):1-9. doi:10.5539/gjhs.

v8n3p1

- 12. Piltan F, Rahmanian M. Investigating factors affecting the tendency toward childbearing among married men and women (case of study: men and women aged 25 to 45 years old in Jahrom). Journal of Iranian Social Development Studies. 2015;7(2):121-134. [Persian].
- Kannan KS, Nagarajan V. Factor and multiple regression analysis for human fertility in kanyakumari district. Anthropologist. 2008;10(3):211-214. doi:10.1080/0972007 3.2008.11891049
- Calhoun LM, Nanda P, Speizer IS, Jain M. The effect of family sex composition on fertility desires and family planning behaviors in urban Uttar Pradesh, India. Reprod Health. 2013;10:48. doi:10.1186/1742-4755-10-48
- Rana S, Midi H, Sarkar SK. Determinants of desire for children: a multinomial logistic regression approach. Life Sci J. 2013;10(2):1460-1467. doi:10.7537/marslsj100213.198
- Sarkar SK, Midi H, Rahmatullah Imon AHM. Binary response model of desire for children in Bangladesh. Eur J Soc Sci. 2009;10(3):364-373.
- Sarkar SK, Midi H. Importance of assessing the model adequacy of binary logistic regression. J Appl Sci. 2010;10(6):479-486. doi:10.3923/jas.2010.479.486
- Bagheri A, Saadati M, Razeghi Nasrabad H. Introduction and application of CART model to classify ideal number of children for 15-49 year-old women, Semnan providence. Journal of Population Association of Iran. 2014;19(17):77-111. [Persian].
- 19. Bagheri A, Saadati M. Desired childless survival interval analysis of pre-marriage youths: log-normal parametric model. Pajoohande. 2016;21(4):199-209. [Persian].
- Bagheri A, Saadati M. Comparing classification tree algorithms to forecast sex preferences of women in marriage threshold. 13th statistical conference, Kerman University; 2016.
- 21. Saadati M, Bagheri A, Razeghi-Nasrabad H. B.B. Modeling Children Ever Born and Ideal Number of Children by Classification Tree. Journal of Research and Heath. 2019; In press.
- Saadati M, Bagheri A. Mining children ever born data; classification tree approach. Indian Journal of Science and Technology. 2015;8(30):1-7. doi:10.17485/ijst/2015/ v8i30/90251
- Cramer JS. The origins of logistic regression. Tinbergen Institute Discussion Paper No. 2002-119/4. Tinbergen Institute; 2002. https://papers.ssrn.com/sol3/papers. cfm?abstract_id=360300.
- Oommen T, Baise LG, Vogel RM. Sampling bias and class imbalance in maximum-likelihood logistic regression. Math Geosci. 2011;43(1):99-120. doi:10.1007/s11004-010-9311-8
- 25. Lemeshow S, Sturdivant R. Applied logistic regression.

Wiley; 2000.

- Camdeviren HA, Yazici AC, Akkus Z, Bugdayci R, Sungur MA. Comparison of logistic regression model and classification tree: An application to postpartum depression data. Expert Syst Appl. 2007;32(4):987-994. doi:10.1016/j. eswa.2006.02.022
- 27. Han J, Pei J, Kamber M. Data mining: concepts and techniques. New York: Elsevier; 2011.
- 28. Shahla K. Childbearing Attitudes and its social, economical and cultural factors. Tehran, Iran: Statistical Research Center; 2014.
- 29. Breiman L, Friedman J, Olshen R, Stone C. Classification and regression trees. Belmont, CA: Wadsworth, Inc; 1984.
- 30. Timofeev R. Classification and regression trees (CART) theory and applications. Berlin: Humboldt University; 2004.
- Saadati M, Bagheri A. Comparing Childlessness Ideal Survival Time of Women in the Threshold of Marriage by Job Status. Conference of Population Change, Human Resources & Employment in Iran; 26-27 October 2016; Yazd University.
- Abbasi-Shavazi MJ, Askari Nadoushan A. Family changes and fertility decline in Iran; case study of Yazd province. Nameh-Ye Olum-E Ejtemai. 2005;24:25-75.
- Saadati M, Bagheri A. Educated Iranian women in favor of having girls: CART classification approach. Mainz, Germany: European Population Conference; 2016.
- 34. Bagheri A, Saadati M, Hossaini S. Modeling mean of children ever born of migrants women to Tehran: regression tress approach, the international conference on migration patterns. consequences and policies, statistical research center. Tehran, Iran: Tarbiat Modares University; 2015.
- Long WJ, Griffith JL, Selker HP, D'Agostino RB. A comparison of logistic regression to decision-tree induction in a medical domain. Comput Biomed Res. 1993;26(1):74-97. doi:10.1006/cbmr.1993.1005
- Rudolfer SM, Paliouras G, Peers IS. A comparison of logistic regression to decision tree induction in the diagnosis of carpal tunnel syndrome. Comput Biomed Res. 1999;32(5):391-414. doi:10.1006/cbmr.1999.1521
- Hosseini H, Asgari-Nadushan A, Moradi N. Comparative study of childbearing desires Shiite and Sunni Kurdish women in rural areas of Kamyaran city. Woman and Family Studies. 2016;4(1):63-84. [Persian].
- Saadati M, Bagheri A. Study of ideal marriage interval to childbearing in terms of youth at the threshold of marriage. Payesh. 2016;17(2):239-250. [Persian].
- Bagi B. The study of unmet need for family planning and its determinants among married women in Mahabad city [thesis]. Hamedan: Faculty of Economics and Social Sciences Bu-Ali Sina University; 2012.

Copyright © 2019 The Author(s); This is an open-access article distributed under the terms of the Creative Commons Attribution License (http://creativecommons.org/licenses/by/4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.