

Age at First Birth, Living Arrangement, Education, and Mental Health Status are Influential to People's Life Satisfaction Level.

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Abstract

This paper uses the General Social Survey data set which is an investigation on respondents' family, marriage, and other different aspects. We create a linear regression model to research Canadians' satisfaction level of life and we find that some living conditions and lifestyles do have influences on it. People's feelings of life will significantly vary with such living conditions. Besides, we add some comments about our model.

Introduction

Family is very important in Canada. Each family member acts an essential role in the family. Canada's government can do more for its citizens to make their life better. Therefore, our goal of this analysis is to find out which aspects mostly influence their satisfaction level of life. If a certain aspect makes people's feelings of life higher, the government should maintain the current policies or benefits which affects this aspect; inversely, the government should publish new policies to improve people's life quality. First of all, we criticize the survey and filter out some variables we are interested in to set up a linear regression model. Secondly, according to the result of the model, we can make a conclusion to verify that the variables we selected are influential on respondents' feelings of life. Lastly, we evaluate our model and figure out how we can make improvement.

Data

Based on this survey and data of from GSS dataset, we can clearly see that two primary objectives of this survey:

1. To gather data on social trends in order to monitor changes in the living conditions and well-being of Canadian over time.
2. To provide information on specific social policy issues of current or emerging interest.

In order to achieve these two objectives, GSS survey data consists of two parts: classification variables and core content. The variables are to divide population groups into certain parts, so that we can do analyze each group deeply, and compare those groups. We collect all the data by a questionnaire asking random people from the sample population. Moreover, we change all the variable names in a meaningful way so that readers can easily understand.

The target population of this survey is all the persons 15 years of age and older in Canada, excluding residents of the Yukon, Northwest Territories, and Nunavut and full-time residents of institutions. The population frame are the lists of telephone numbers in use available to Statistics Canada from various sources and the Address Register.

The variables we use from the dataset are age, total children, age at first birth, province, pop centre, marital status education, own rent, living arrangement, average hours worked, self rated health, self rated mental health, income respondent and children in household.

According to the summary of the questionnaire content, we observe that most of questions are open-ended type which gives us richer and detailed responses, making the survey results more personalized. However, the cons are the difficulty to analyze the data and more time to spend gathering and reading them, such that intentions and reasons to form a union and organization and decision making within the household. Meanwhile, closed question such as entry component and the time leaving the parental home are given numerical information which are easy to make a report, nevertheless, there may exist some limitation of the report data based on the closed question, we cannot be able to consider the special cases among these samples.

Additionally, based on the content of those questions, since the survey questions are individualized, therefore, those questions are unbiased and balanced. On the other hand, due to question specification, survey requires detailed responses from each person. Thus, people who cannot answer certain questions may give up the survey and we may lose the information from them which makes the results unfair to represent the target people. For example, asking a teenager whose age is 20 about arrangements and financial support after a separation or divorce does not make any sense, since he/she has not experienced a separation or divorce with his/her partner. Such questions only bring us issues of under-reporting. Besides, some questions are not easy and clear to understand which makes people lose interest to complete this survey. Those concerns may fail us to monitor changes in the living conditions and well-being of Canadian somehow.

Model

```
##
## Call:
## lm(formula = feelings_life ~ age + total_children + age_at_first_birth +
##      province + pop_center + marital_status + education + own_rent +
##      living_arrangement + average_hours_worked + selfRated_health +
##      selfRated_mental_health + income_respondent + children_in_household,
##      data = data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -8.3556 -0.7188  0.0752  0.8691  6.2759
##
## Coefficients: (1 not defined because of singularities)
##                                     Estimate
## (Intercept)                        6.513515
## age                                0.005037
## total_children                     0.016650
## age_at_first_birth                 -0.014544
## provinceBritish Columbia          0.042408
## provinceManitoba                  0.116892
## provinceNew Brunswick             0.263218
## provinceNewfoundland and Labrador 0.192616
## provinceNova Scotia               0.107842
## provinceOntario                   0.064210
## provincePrince Edward Island      0.227620
## provinceQuebec                    0.034881
## provinceSaskatchewan              0.180373
## pop_centerPrince Edward Island      NA
## pop_centerRural areas and small population centres (non CMA/CA) 0.083892
## marital_statusLiving common-law     0.509039
## marital_statusMarried               0.586853
## marital_statusSeparated             -0.228992
## marital_statusSingle, never married -0.135825
## marital_statusWidowed              -0.290316
## educationCollege, CEGEP or other non-university certificate or di... 0.044337
## educationHigh school diploma or a high school equivalency certificate 0.058890
## educationLess than high school diploma or its equivalent          0.247640
## educationTrade certificate or diploma                             0.101957
## educationUniversity certificate or diploma below the bachelor's level 0.080542
## educationUniversity certificate, diploma or degree above the bach... -0.025922
## own_rentOwned by you or a member of this household, even if it i... 0.131805
## own_rentRented, even if no cash rent is paid                     -0.006973
## living_arrangementLiving with one parent                         -0.590050
## living_arrangementLiving with two parents                       0.002962
## living_arrangementNo spouse and non-single child(ren)          -0.648299
## living_arrangementNo spouse and single child 25 years of age or older -0.015069
## living_arrangementNo spouse and single child under 25 years of age 0.062126
## living_arrangementOther living arrangement                     -0.175915
## living_arrangementSpouse and non-single child(ren)             -0.009678
## living_arrangementSpouse and other                             0.059494
## living_arrangementSpouse and single child 25 years of age or older -0.314601
## living_arrangementSpouse and single child under 25 years of age -0.206643
## living_arrangementSpouse only                                   -0.094408
## average_hours_worked0.1 to 29.9 hours                          0.179005
## average_hours_worked30.0 to 40.0 hours                        0.152118
## average_hours_worked40.1 to 50.0 hours                       0.203257
## average_hours_worked50.1 hours and more                       0.204658
```

| | |
|--|------------|
| ## average_hours_workedDon't know | -0.083818 |
| ## self_rated_healthExcellent | 0.798101 |
| ## self_rated_healthFair | 0.175818 |
| ## self_rated_healthGood | 0.452526 |
| ## self_rated_healthPoor | -0.186612 |
| ## self_rated_healthVery good | 0.582822 |
| ## self_rated_mental_healthExcellent | 1.121710 |
| ## self_rated_mental_healthFair | -0.786031 |
| ## self_rated_mental_healthGood | 0.093460 |
| ## self_rated_mental_healthPoor | -2.838867 |
| ## self_rated_mental_healthVery good | 0.700676 |
| ## income_respondent\$125,000 and more | 0.068906 |
| ## income_respondent\$25,000 to \$49,999 | -0.027607 |
| ## income_respondent\$50,000 to \$74,999 | -0.009377 |
| ## income_respondent\$75,000 to \$99,999 | 0.039905 |
| ## income_respondentLess than \$25,000 | -0.058830 |
| ## children_in_householdOne child | 0.065635 |
| ## children_in_householdThree or more children | 0.133838 |
| ## children_in_householdTwo children | 0.115780 |
| ## | Std. Error |
| ## (Intercept) | 0.783528 |
| ## age | 0.002230 |
| ## total_children | 0.018527 |
| ## age_at_first_birth | 0.003421 |
| ## provinceBritish Columbia | 0.067003 |
| ## provinceManitoba | 0.079020 |
| ## provinceNew Brunswick | 0.077527 |
| ## provinceNewfoundland and Labrador | 0.080851 |
| ## provinceNova Scotia | 0.076626 |
| ## provinceOntario | 0.058103 |
| ## provincePrince Edward Island | 0.091674 |
| ## provinceQuebec | 0.063273 |
| ## provinceSaskatchewan | 0.076523 |
| ## pop_centerPrince Edward Island | NA |
| ## pop_centerRural areas and small population centres (non CMA/CA) | 0.039573 |
| ## marital_statusLiving common-law | 0.127777 |
| ## marital_statusMarried | 0.119765 |
| ## marital_statusSeparated | 0.086868 |
| ## marital_statusSingle, never married | 0.077816 |
| ## marital_statusWidowed | 0.100454 |
| ## educationCollege, CEGEP or other non-university certificate or di... | 0.044638 |
| ## educationHigh school diploma or a high school equivalency certificate | 0.048162 |
| ## educationLess than high school diploma or its equivalent | 0.066479 |
| ## educationTrade certificate or diploma | 0.062188 |
| ## educationUniversity certificate or diploma below the bachelor's level | 0.081184 |
| ## educationUniversity certificate, diploma or degree above the bach... | 0.055472 |
| ## own_rentOwned by you or a member of this household, even if it i... | 0.329556 |
| ## own_rentRented, even if no cash rent is paid | 0.331281 |
| ## living_arrangementLiving with one parent | 0.251841 |
| ## living_arrangementLiving with two parents | 0.454193 |
| ## living_arrangementNo spouse and non-single child(ren) | 0.634206 |
| ## living_arrangementNo spouse and single child 25 years of age or older | 0.148021 |
| ## living_arrangementNo spouse and single child under 25 years of age | 0.079717 |
| ## living_arrangementOther living arrangement | 0.101093 |
| ## living_arrangementSpouse and non-single child(ren) | 0.528438 |
| ## living_arrangementSpouse and other | 0.194953 |
| ## living_arrangementSpouse and single child 25 years of age or older | 0.147425 |
| ## living_arrangementSpouse and single child under 25 years of age | 0.120366 |

| | |
|--|----------|
| ## living_arrangementSpouse only | 0.120289 |
| ## average_hours_worked0.1 to 29.9 hours | 0.340146 |
| ## average_hours_worked30.0 to 40.0 hours | 0.339091 |
| ## average_hours_worked40.1 to 50.0 hours | 0.341247 |
| ## average_hours_worked50.1 hours and more | 0.342697 |
| ## average_hours_workedDon't know | 0.349896 |
| ## selfRated_healthExcellent | 0.402338 |
| ## selfRated_healthFair | 0.404743 |
| ## selfRated_healthGood | 0.401509 |
| ## selfRated_healthPoor | 0.420451 |
| ## selfRated_healthVery good | 0.401497 |
| ## selfRated_mental_healthExcellent | 0.449373 |
| ## selfRated_mental_healthFair | 0.453871 |
| ## selfRated_mental_healthGood | 0.448792 |
| ## selfRated_mental_healthPoor | 0.478151 |
| ## selfRated_mental_healthVery good | 0.448906 |
| ## income_respondent\$125,000 and more | 0.080748 |
| ## income_respondent\$25,000 to \$49,999 | 0.066195 |
| ## income_respondent\$50,000 to \$74,999 | 0.066337 |
| ## income_respondent\$75,000 to \$99,999 | 0.069709 |
| ## income_respondentLess than \$25,000 | 0.071826 |
| ## children_in_householdOne child | 0.059053 |
| ## children_in_householdThree or more children | 0.083066 |
| ## children_in_householdTwo children | 0.060386 |
| ## | t value |
| ## (Intercept) | 8.313 |
| ## age | 2.259 |
| ## total_children | 0.899 |
| ## age_at_first_birth | -4.252 |
| ## provinceBritish Columbia | 0.633 |
| ## provinceManitoba | 1.479 |
| ## provinceNew Brunswick | 3.395 |
| ## provinceNewfoundland and Labrador | 2.382 |
| ## provinceNova Scotia | 1.407 |
| ## provinceOntario | 1.105 |
| ## provincePrince Edward Island | 2.483 |
| ## provinceQuebec | 0.551 |
| ## provinceSaskatchewan | 2.357 |
| ## pop_centerPrince Edward Island | NA |
| ## pop_centerRural areas and small population centres (non CMA/CA) | 2.120 |
| ## marital_statusLiving common-law | 3.984 |
| ## marital_statusMarried | 4.900 |
| ## marital_statusSeparated | -2.636 |
| ## marital_statusSingle, never married | -1.745 |
| ## marital_statusWidowed | -2.890 |
| ## educationCollege, CEGEP or other non-university certificate or di... | 0.993 |
| ## educationHigh school diploma or a high school equivalency certificate | 1.223 |
| ## educationLess than high school diploma or its equivalent | 3.725 |
| ## educationTrade certificate or diploma | 1.640 |
| ## educationUniversity certificate or diploma below the bachelor's level | 0.992 |
| ## educationUniversity certificate, diploma or degree above the bach... | -0.467 |
| ## own_rentOwned by you or a member of this household, even if it i... | 0.400 |
| ## own_rentRented, even if no cash rent is paid | -0.021 |
| ## living_arrangementLiving with one parent | -2.343 |
| ## living_arrangementLiving with two parents | 0.007 |
| ## living_arrangementNo spouse and non-single child(ren) | -1.022 |
| ## living_arrangementNo spouse and single child 25 years of age or older | -0.102 |
| ## living_arrangementNo spouse and single child under 25 years of age | 0.779 |

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## living_arrangementOther living arrangement -1.740
## living_arrangementSpouse and non-single child(ren) -0.018
## living_arrangementSpouse and other 0.305
## living_arrangementSpouse and single child 25 years of age or older -2.134
## living_arrangementSpouse and single child under 25 years of age -1.717
## living_arrangementSpouse only -0.785
## average_hours_worked0.1 to 29.9 hours 0.526
## average_hours_worked30.0 to 40.0 hours 0.449
## average_hours_worked40.1 to 50.0 hours 0.596
## average_hours_worked50.1 hours and more 0.597
## average_hours_workedDon't know -0.240
## selfRated_healthExcellent 1.984
## selfRated_healthFair 0.434
## selfRated_healthGood 1.127
## selfRated_healthPoor -0.444
## selfRated_healthVery good 1.452
## selfRated_mental_healthExcellent 2.496
## selfRated_mental_healthFair -1.732
## selfRated_mental_healthGood 0.208
## selfRated_mental_healthPoor -5.937
## selfRated_mental_healthVery good 1.561
## income_respondent$125,000 and more 0.853
## income_respondent$25,000 to $49,999 -0.417
## income_respondent$50,000 to $74,999 -0.141
## income_respondent$75,000 to $99,999 0.572
## income_respondentLess than $25,000 -0.819
## children_in_householdOne child 1.111
## children_in_householdThree or more children 1.611
## children_in_householdTwo children 1.917
## Pr(>|t|)
## (Intercept) < 2e-16
## age 0.023917
## total_children 0.368855
## age_at_first_birth 2.15e-05
## provinceBritish Columbia 0.526796
## provinceManitoba 0.139110
## provinceNew Brunswick 0.000689
## provinceNewfoundland and Labrador 0.017227
## provinceNova Scotia 0.159354
## provinceOntario 0.269148
## provincePrince Edward Island 0.013053
## provinceQuebec 0.581461
## provinceSaskatchewan 0.018444
## pop_centerPrince Edward Island NA
## pop_centerRural areas and small population centres (non CMA/CA) 0.034042
## marital_statusLiving common-law 6.85e-05
## marital_statusMarried 9.79e-07
## marital_statusSeparated 0.008404
## marital_statusSingle, never married 0.080944
## marital_statusWidowed 0.003863
## educationCollege, CEGEP or other non-university certificate or di... 0.320611
## educationHigh school diploma or a high school equivalency certificate 0.221458
## educationLess than high school diploma or its equivalent 0.000197
## educationTrade certificate or diploma 0.101151
## educationUniversity certificate or diploma below the bachelor's level 0.321186
## educationUniversity certificate, diploma or degree above the bach... 0.640302
## own_rentOwned by you or a member of this household, even if it i... 0.689207
## own_rentRented, even if no cash rent is paid 0.983206

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## living_arrangementLiving with one parent 0.019159
## living_arrangementLiving with two parents 0.994796
## living_arrangementNo spouse and non-single child(ren) 0.306709
## living_arrangementNo spouse and single child 25 years of age or older 0.918913
## living_arrangementNo spouse and single child under 25 years of age 0.435809
## living_arrangementOther living arrangement 0.081878
## living_arrangementSpouse and non-single child(ren) 0.985389
## living_arrangementSpouse and other 0.760245
## living_arrangementSpouse and single child 25 years of age or older 0.032878
## living_arrangementSpouse and single child under 25 years of age 0.086059
## living_arrangementSpouse only 0.432574
## average_hours_worked0.1 to 29.9 hours 0.598723
## average_hours_worked30.0 to 40.0 hours 0.653730
## average_hours_worked40.1 to 50.0 hours 0.551441
## average_hours_worked50.1 hours and more 0.550393
## average_hours_workedDon't know 0.810685
## self_rated_healthExcellent 0.047331
## self_rated_healthFair 0.664014
## self_rated_healthGood 0.259752
## self_rated_healthPoor 0.657172
## self_rated_healthVery good 0.146650
## self_rated_mental_healthExcellent 0.012576
## self_rated_mental_healthFair 0.083344
## self_rated_mental_healthGood 0.835042
## self_rated_mental_healthPoor 3.03e-09
## self_rated_mental_healthVery good 0.118601
## income_respondent$125,000 and more 0.393493
## income_respondent$25,000 to $49,999 0.676651
## income_respondent$50,000 to $74,999 0.887588
## income_respondent$75,000 to $99,999 0.567030
## income_respondentLess than $25,000 0.412777
## children_in_householdOne child 0.266411
## children_in_householdThree or more children 0.107174
## children_in_householdTwo children 0.055234
##
## (Intercept) ***
## age *
## total_children
## age_at_first_birth ***
## provinceBritish Columbia
## provinceManitoba
## provinceNew Brunswick ***
## provinceNewfoundland and Labrador *
## provinceNova Scotia
## provinceOntario
## provincePrince Edward Island *
## provinceQuebec
## provinceSaskatchewan *
## pop_centerPrince Edward Island
## pop_centerRural areas and small population centres (non CMA/CA) *
## marital_statusLiving common-law ***
## marital_statusMarried ***
## marital_statusSeparated **
## marital_statusSingle, never married .
## marital_statusWidowed **
## educationCollege, CEGEP or other non-university certificate or di...
## educationHigh school diploma or a high school equivalency certificate
## educationLess than high school diploma or its equivalent ***

```

```
## educationTrade certificate or diploma
## educationUniversity certificate or diploma below the bachelor's level
## educationUniversity certificate, diploma or degree above the bach...
## own_rentOwned by you or a member of this household, even if it i...
## own_rentRented, even if no cash rent is paid
## living_arrangementLiving with one parent *
## living_arrangementLiving with two parents
## living_arrangementNo spouse and non-single child(ren)
## living_arrangementNo spouse and single child 25 years of age or older
## living_arrangementNo spouse and single child under 25 years of age
## living_arrangementOther living arrangement .
## living_arrangementSpouse and non-single child(ren)
## living_arrangementSpouse and other
## living_arrangementSpouse and single child 25 years of age or older *
## living_arrangementSpouse and single child under 25 years of age .
## living_arrangementSpouse only
## average_hours_worked0.1 to 29.9 hours
## average_hours_worked30.0 to 40.0 hours
## average_hours_worked40.1 to 50.0 hours
## average_hours_worked50.1 hours and more
## average_hours_workedDon't know
## selfRated healthExcellent *
## selfRated healthFair
## selfRated healthGood
## selfRated healthPoor
## selfRated healthVery good
## selfRated mental healthExcellent *
## selfRated mental healthFair .
## selfRated mental healthGood
## selfRated mental healthPoor ***
## selfRated mental healthVery good
## income_respondent$125,000 and more
## income_respondent$25,000 to $49,999
## income_respondent$50,000 to $74,999
## income_respondent$75,000 to $99,999
## income_respondentLess than $25,000
## children_in_householdOne child
## children_in_householdThree or more children
## children_in_householdTwo children .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 1.26 on 7342 degrees of freedom
## (13199 observations deleted due to missingness)
## Multiple R-squared:  0.2744, Adjusted R-squared:  0.2684
## F-statistic: 46.27 on 60 and 7342 DF,  p-value: < 2.2e-16
```

We set a linear regression model with `feelings_life` as a response variable versus many other living conditions as predictors. Predictors include `age`, `total_children`, `age_at_first_birth`, `province`, `pop_center`, `marital_status`, `education`, `own_rent`, `living_arrangement`, `average_hours_worked`, `selfRated health`, `selfRated mental health`, `income_respondent`, `children_in_household`. We choose these variables because they were fully answered (with only a few NA), so such variables are more reliable.

From the regression model, we can establish a mathematical function: $\text{feelings_life} = 6.513515 - 0.014544 * \text{age_at_first_birth} + 0.263218 * \text{provinceNew Brunswick} + 0.509039 * \text{marital_statusLiving common-law} + 0.586853 * \text{marital_statusMarried} + 0.24764 * \text{educationLess than high school diploma or its equivalent} - 2.838867 * \text{selfRated mental healthPoor} + 1.26$

This model can help us to research which living conditions make big differences on feelings of life and how people's satisfaction of life changes with such variables numerically. As some of living conditions are categorical. So in the linear equation, it means that 1 represents it while 0 represents any other options in the same aspect.

Results

According to the linear regression summary created above, we find that there are 5 living conditions including at least one option with p-value locating between 0 and 0.001. A predictor with a low p-value is likely to be a meaningful addition to the model because changes in the predictor's value are related to changes in the response variable. That is to say, these variables can affect people's feelings of life mostly. Variables are:

- 1.age of respondents at giving first birth
- 2.respondents living in province New Brunswick
- 3.respondents living with common-law couple
- 4.respondents living with married couple
- 5.respondents with education less than high school diploma or its equivalent
- 6.respondents with low self-rated mental health

Recall the function of new model: $\text{feelings_life} = 6.513515 - 0.014544 * \text{age_at_first_birth} + 0.263218 * \text{provinceNew Brunswick} + 0.509039 * \text{marital_statusLiving common-law} + 0.586853 * \text{marital_statusMarried} + 0.24764 * \text{educationLess than high school diploma or its equivalent} - 2.838867 * \text{self_rated_mental_healthPoor} + 1.26$

- 1.When all other variables are zero, respondents' satisfaction score is about 6.513515.
- 2.As age of respondents at giving first birth increases by 1 unit, the satisfaction score decreases by 0.014544 units.
- 3.As the respondent living in province New Brunswick, the satisfaction score increases by 0.263218 units.
- 4.As the respondent living living with common-law couple, the satisfaction score increases by 0.509039 units.
- 5.As the respondent living living with married couple, the satisfaction score increases by 0.586853 units.
- 6.As the respondent get education less than high school diploma or its equivalent, the satisfaction score increases by 0.24764 units.
- 7.As the respondent have low self-rated mental health, the satisfaction score decreases by 2.838867 units.

We also find that r-squared which represents the proportion of the variance for a dependent variable that's explained by variables in regression model is 0.2684. Thus, about a quarter of the observed variation can be explained by the model's inputs.

Discussion

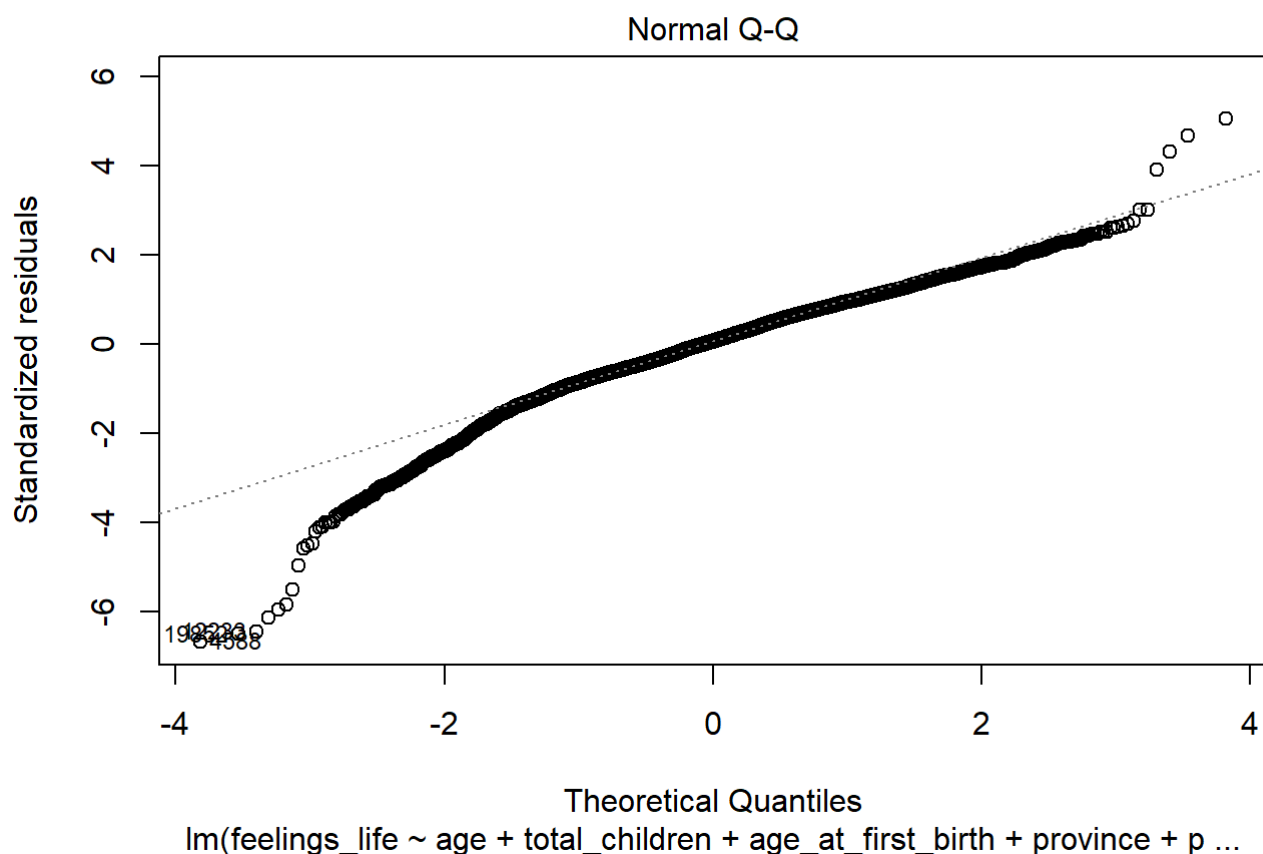
In conclusion, among 6 effectively-influential variables, provinceNew Brunswick, marital_statusLiving common-law, marital_statusMarried, educationLess than high school diploma or its equivalent have positive effects while age_at_first_birth and self_rated_mental_healthPoor are negatively influenced. Therefore, respondents will have more satisfaction on life if they live with someone else which is because they will not feel lonely and reunion always brings joy. Additionally, the later respondents having a child and the worse their mental is, the less satisfaction they have in lives. The former is because of children may cost a lot (i.e. money and time) and

young respondents do not have enough ability to afford it, which give a heavy burden on them instead of felicity. The latter, mental health is a direct reason relating to the feelings of life. Respondents bothering with illness from mentality will definitely feel depressed in their lives.

Therefore, government could establish policies such as giving out subsidies to those who are under the average financial level, increasing the child benefit so that they can afford the pressure of having a child when they are young, and providing more free mental health assistance.

The data set came from the result of the questioner of the General Social Survey, which was conducted by the Canadian government in 2017 for the purpose on family and household issues. There are still some limitations because our model is still a prediction model, it is possible for some errors to exist which cause it a bit different from the true relationship. Also, not everyone in the world follows the same model pattern, it is possible to appear restrictions.

Weaknesses



In order to check the accuracy of our model, we create a normal Q-Q plot which shows if residuals are normally distributed. It is illustrated that around a quarter of the residuals are off the straight dashed line. Overall, it is not good enough to say that residuals are normally distributed since it is heavy tailed.

There are too many categorical variables in this GSS data set, therefore it is sometimes hard to create a perfect model to demonstrate our analysis.

Next Steps

We can include more variables to set up the model and see if there will be a possible better model than the one we created previously, since it was not that accurate according to the normal Q-Q plot. Also, we can introduce other methods to fit a model, such as cross validations and box-cox transformations.

We can also conduct a follow-up survey on only testing respondents' feelings/satisfaction on life. From the follow-up survey, we can find out if the variables we selected in the above model are actually influential, and we can also investigate on other factors which will make changes on this topic.

References

1. citation of "tidyverse" - a statistical package.