

EDA

Loading the required libraries

```
library(survey)

## Loading required package: grid
## Loading required package: Matrix
## Loading required package: survival

##
## Attaching package: 'survey'

## The following object is masked from 'package:graphics':
##
##     dotchart

library(sampling)

##
## Attaching package: 'sampling'

## The following objects are masked from 'package:survival':
##
##     cluster, strata

library('ISLR')
library('ggplot2')
library(MASS)
library(tree)

library(dplyr)

##
## Attaching package: 'dplyr'

## The following object is masked from 'package:MASS':
##
##     select

## The following objects are masked from 'package:stats':
##
##     filter, lag

## The following objects are masked from 'package:base':
##
##     intersect, setdiff, setequal, union
```

Loading the dataset

```
# Load the dataset
yyc_survey <- read.csv("Citizen_Satisfaction_Survey.csv")

#column names of the dataset
names(yyc_survey)

## [1] "Mweight0" "qwave" "s4qt" "market2" "q39" "q34"
## [7] "q37" "q38" "q30" "q32x" "q40" "sexfix"
## [13] "q29x" "q2a" "q3" "q24bx_1" "q24bx_2" "q24bx_3"
## [19] "q24bx_4" "q24bx_5" "q24bx_6" "q24bx_7" "q24cx" "q10"
## [25] "q19_1" "q19_2" "q19_3" "q19_4" "q19_5" "q19_6"
## [31] "q19_7" "q19_8" "q11a" "q12" "q8_1" "q8_2"
## [37] "q8_3" "q8_4" "q8_5" "q8_6" "q8_7" "q8_8"
## [43] "q8_9" "q8_10" "q8_11" "q8_12" "q8_13" "q8_14"
## [49] "q8_15" "q8_16" "q8_17" "q8_18" "q8_19" "q8_20"
## [55] "q8_21" "q8_22" "q8_23" "q8_24" "q8_25" "q8_26"
## [61] "q8_27" "q8_28" "q8_29" "q8_30" "q8_31" "q8_32"
## [67] "q8_33" "q8_34" "q8_35" "q9_1_1" "q9_1_2" "q9_1_3"
## [73] "q9_1_4" "q9_1_5" "q9_1_6" "q9_1_7" "q9_1_8" "q9_1_9"
## [79] "q9_1_10" "q9_1_11" "q9_1_12" "q9_1_13" "q9_1_14" "q9_1_15"
## [85] "q9_1_16" "q9_1_17" "q9_1_18" "q9_1_19" "q9_1_20" "q9_1_21"
## [91] "q9_1_22" "q9_1_23" "q9_1_24" "q9_1_25" "q9_1_26" "q9_1_27"
## [97] "q9_1_28" "q9_1_29" "q9_1_30" "q9_1_31" "q9_1_32" "q9_1_33"
## [103] "q9_1_34" "q9_1_35" "q9_2_1" "q9_2_2" "q9_2_3" "q9_2_4"
## [109] "q9_2_5" "q9_2_6" "q9_2_7" "q9_2_8" "q9_2_9" "q9_2_10"
## [115] "q9_2_11" "q9_2_12" "q9_2_13" "q9_2_14" "q9_2_15" "q9_2_16"
## [121] "q9_2_17" "q9_2_18" "q9_2_19" "q9_2_20" "q9_2_21" "q9_2_22"
## [127] "q9_2_23" "q9_2_24" "q9_2_25" "q9_2_26" "q9_2_27" "q9_2_28"
## [133] "q9_2_29" "q9_2_30" "q9_2_31" "q9_2_32" "q9_2_33" "q9_2_34"
## [139] "q9_2_35"

#dim of the dataset
dim(yyc_survey)

## [1] 10002 139
```

Inspecting the dataset

```
head(yyc_survey)

## Mweight0 qwave s4qt market2 q39 q34 q37 q38 q30 q32x q40 sexfix q29x
## 1 0.51 Year-2021 4 10 4 1 9 3 6 2 2 2 1
## 2 0.60 Year-2021 1 8 1 1 9 2 6 2 2 1 2
## 3 0.70 Year-2021 2 12 7 1 8 2 6 2 2 2 1
## 4 0.49 Year-2021 3 6 9 1 8 3 6 2 3 2 1
```

7	## 5	0.77	Year-2021	1	11	4	1	10	2	5	2	2	2	1
8	## 6	0.67	Year-2021	1	6	1	2	1	3	6	2	1	1	2
7	##	q3	q24bx_1	q24bx_2	q24bx_3	q24bx_4	q24bx_5	q24bx_6	q24bx_7	q24cx	q10			
	q19_1													
	## 1	2	5	5	7	6	1	4	3	3	2			
	NA													
	## 2	2	6	7	7	7	6	6	6	4	2			
	NA													
	## 3	3	5	3	5	5	1	5	8	3	4			
	NA													
	## 4	3	6	1	10	10	1	4	9	3	1			
	NA													
	## 5	1	7	3	7	8	7	5	8	3	4			
	NA													
	## 6	2	6	7	8	8	6	6	7	2	2			
	NA													
	##	q19_2	q19_3	q19_4	q19_5	q19_6	q19_7	q19_8	q11a	q12	q8_1	q8_2	q8_3	q8_4
	q8_5													
	## 1	1	4	1	1	NA	1	1	5	4	5	5	5	5
	5													
	## 2	3	4	4	4	NA	4	4	7	2	5	5	5	5
	5													
	## 3	2	3	5	3	NA	3	3	7	2	4	4	4	4
	3													
	## 4	5	5	1	3	NA	3	2	8	4	5	5	5	5
	5													
	## 5	4	4	4	2	NA	1	1	8	2	5	5	5	5
	5													
	## 6	1	3	1	3	NA	5	3	6	5	5	5	5	5
	5													
	##	q8_6	q8_7	q8_8	q8_9	q8_10	q8_11	q8_12	q8_13	q8_14	q8_15	q8_16	q8_17	
	q8_18													
	## 1	5	5	5	5	5	5	5	5	5	5	5	5	
	5													
	## 2	5	5	5	5	5	5	5	5	5	5	5	5	
	5													
	## 3	2	4	2	4	4	2	4	4	4	4	4	3	
	2													
	## 4	5	5	5	5	5	5	5	5	5	5	5	5	
	5													
	## 5	5	5	5	5	5	5	5	5	5	5	5	5	
	5													
	## 6	5	5	5	5	5	5	5	5	5	5	5	5	
	5													
	##	q8_19	q8_20	q8_21	q8_22	q8_23	q8_24	q8_25	q8_26	q8_27	q8_28	q8_29	q8_30	
	q8_31													
	## 1	2	1	4	3	4	4	1	1	1	3	4	4	

3													
## 2	4	4	4	4	3	3	2	4	3	4	4	4	4
4													
## 3	5	5	5	5	5	5	5	5	5	5	5	5	5
5													
## 4	4	4	4	4	4	4	4	3	4	5	4	5	5
4													
## 5	4	2	4	4	4	3	4	4	4	4	4	3	3
4													
## 6	4	4	4	4	4	4	4	4	4	4	4	4	4
4													
##	q8_32	q8_33	q8_34	q8_35	q9_1_1	q9_1_2	q9_1_3	q9_1_4	q9_1_5	q9_1_6	q9_1_7		
## 1	1	4	2	4	5	5	5	5	5	5	5	5	5
## 2	4	4	1	4	5	5	5	5	5	5	5	5	5
## 3	5	5	5	5	4	4	3	3	3	3	3	4	4
## 4	4	4	4	4	5	5	5	5	5	5	5	5	5
## 5	4	3	3	2	5	5	5	5	5	5	5	5	5
## 6	4	4	3	3	5	5	5	5	5	5	5	5	5
##	q9_1_8	q9_1_9	q9_1_10	q9_1_11	q9_1_12	q9_1_13	q9_1_14	q9_1_15	q9_1_16				
q9_1_17													
## 1	5	5	5	5	5	5	5	5	5	5	5	5	5
5													
## 2	5	5	5	5	5	5	5	5	5	5	5	5	5
5													
## 3	3	4	3	3	3	3	3	3	3	3	3	3	3
3													
## 4	5	5	5	5	5	5	5	5	5	5	5	5	5
5													
## 5	5	5	5	5	5	5	5	5	5	5	5	5	5
5													
## 6	5	5	5	5	5	5	5	5	5	5	5	5	5
5													
##	q9_1_18	q9_1_19	q9_1_20	q9_1_21	q9_1_22	q9_1_23	q9_1_24	q9_1_25	q9_1_26				
## 1	5	2	2	1	3	1	3	1	1				
## 2	5	3	4	4	3	3	3	4	4				
## 3	3	5	5	5	5	5	5	5	5				
## 4	5	2	4	3	3	4	4	3	3				
## 5	5	4	3	3	2	4	3	3	2				
## 6	5	3	3	2	2	3	3	3	2				
##	q9_1_27	q9_1_28	q9_1_29	q9_1_30	q9_1_31	q9_1_32	q9_1_33	q9_1_34	q9_1_35				
## 1	1	3	2	5	1	1	1	1	2				
## 2	3	3	3	3	3	3	3	5	4				
## 3	5	5	5	5	5	5	5	5	5				
## 4	4	5	3	5	2	3	1	1	1				
## 5	3	2	3	3	2	3	2	3	3				
## 6	3	2	3	3	2	5	2	3	5				
##	q9_2_1	q9_2_2	q9_2_3	q9_2_4	q9_2_5	q9_2_6	q9_2_7	q9_2_8	q9_2_9	q9_2_10			
## 1	4	4	4	4	4	4	4	4	4	4			
## 2	4	4	4	4	4	4	4	4	4	4			
## 3	1	1	3	1	3	3	3	3	3	1			

```
## 4      4      4      4      4      4      4      4      4      4      4
## 5      4      4      4      4      4      4      4      4      4      4
## 6      4      4      4      4      4      4      4      4      4      4
##   q9_2_11 q9_2_12 q9_2_13 q9_2_14 q9_2_15 q9_2_16 q9_2_17 q9_2_18 q9_2_19
## 1      4      4      4      4      4      4      4      4      2
## 2      4      4      4      4      4      4      4      4      1
## 3      1      3      3      1      1      1      2      3      4
## 4      4      4      4      4      4      4      4      4      1
## 5      4      4      4      4      4      4      4      4      3
## 6      4      4      4      4      4      4      4      4      3
##   q9_2_20 q9_2_21 q9_2_22 q9_2_23 q9_2_24 q9_2_25 q9_2_26 q9_2_27 q9_2_28
## 1      2      1      3      1      3      2      2      2      2
## 2      1      1      1      1      1      1      1      1      1
## 3      4      4      4      4      4      4      4      4      4
## 4      3      1      1      3      3      1      2      3      4
## 5      3      3      1      3      1      1      1      1      1
## 6      1      3      1      1      1      1      1      1      3
##   q9_2_29 q9_2_30 q9_2_31 q9_2_32 q9_2_33 q9_2_34 q9_2_35
## 1      2      3      2      2      2      2      1
## 2      1      1      1      1      1      1      1
## 3      4      4      4      4      4      4      4
## 4      3      4      3      1      1      3      1
## 5      3      3      1      1      2      1      2
## 6      1      1      1      3      3      3      3
```

```
table(yyc_survey$qwave)
```

```
##
## Year-2018 Year-2019 Year-2020 Year-2021
##      2500      2502      2500      2500
```

For our current study we only want to use the 2021 survey data:

```
library(dplyr)
```

```
# filter to include only the survey responses from year 2021
filtered_df <- yyc_survey %>% filter(qwave == 'Year-2021')
```

```
dim(filtered_df)
```

```
## [1] 2500 139
```

```
unique(filtered_df$qwave)
```

```
## [1] "Year-2021"
```

Select the columns to include only demographic features and response variable

```
filtered_df <- filtered_df %>% select(s4qt, q39, q34, q37, q38, q32x, q40, q29x, q30, q2a)
```

```
dim(filtered_df)
```

```
## [1] 2500 10
```

Rename the column names for ease.

```
renamed_df <- filtered_df %>% rename("Quadrant" = s4qt, "Income" = q39, "Tenancy" = q34, "Years_in_yyc" = q37, "Education" = q38, "Children" = q32x, "Minority" = q40, "Gender" = q29x, "Age" = q30, "Satisfaction_level" = q2a )  
names(renamed_df)
```

```
## [1] "Quadrant"          "Income"            "Tenancy"  
## [4] "Years_in_yyc"      "Education"          "Children"  
## [7] "Minority"          "Gender"             "Age"  
## [10] "Satisfaction_level"
```

Satisfaction_level is our response variable. **Quadrant, Income, Tenancy, Years_in_yyc, Education, Children, Minority, Gender, Age** are our predictor variables. ## Inspect the structure of our df

```
str(renamed_df)
```

```
## 'data.frame': 2500 obs. of 10 variables:  
## $ Quadrant : int 4 1 2 3 1 1 1 2 1 1 ...  
## $ Income : int 4 1 7 9 4 1 4 7 9 2 ...  
## $ Tenancy : int 1 1 1 1 1 2 1 1 1 1 ...  
## $ Years_in_yyc : int 9 9 8 8 10 1 11 8 3 7 ...  
## $ Education : int 3 2 2 3 2 3 3 2 2 3 ...  
## $ Children : int 2 2 2 2 2 2 2 2 1 2 ...  
## $ Minority : int 2 2 2 3 2 1 2 2 2 2 ...  
## $ Gender : int 1 2 1 1 1 2 1 1 1 1 ...  
## $ Age : int 6 6 6 6 5 6 6 5 4 6 ...  
## $ Satisfaction_level: int 6 6 8 7 8 7 7 10 8 5 ...
```

```
df <- renamed_df
```

```
str(df)
```

```
## 'data.frame': 2500 obs. of 10 variables:  
## $ Quadrant : int 4 1 2 3 1 1 1 2 1 1 ...  
## $ Income : int 4 1 7 9 4 1 4 7 9 2 ...  
## $ Tenancy : int 1 1 1 1 1 2 1 1 1 1 ...  
## $ Years_in_yyc : int 9 9 8 8 10 1 11 8 3 7 ...  
## $ Education : int 3 2 2 3 2 3 3 2 2 3 ...  
## $ Children : int 2 2 2 2 2 2 2 2 1 2 ...  
## $ Minority : int 2 2 2 3 2 1 2 2 2 2 ...
```

```
## $ Gender          : int  1 2 1 1 1 2 1 1 1 1 ...
## $ Age             : int  6 6 6 6 5 6 6 5 4 6 ...
## $ Satisfaction_level: int  6 6 8 7 8 7 7 10 8 5 ...
```

Our predictors and response variables are categorical but are coded as int. Let us take a closer look at each variable

variable “Quadrant”

```
table(df$Quadrant)
```

```
##
##  1    2    3    4
## 659 603 721 517
```

Converting the Quadrant column to nominal column

```
df <- df %>%
  mutate(Quadrant = factor(Quadrant, levels = c(1, 2, 3, 4),
                           labels = c("SW", "SE", "NW", "NE")))
```

```
table(df$Quadrant)
```

```
##
## SW  SE  NW  NE
## 659 603 721 517
```

Variable “Income”

```
table(df$Income)
```

```
##
##  1    2    3    4    5    6    7    8    9
## 153 179 241 179 190 254 203 240 861
```

```
df <- df %>%
  mutate(Income = factor(Income, levels = c(1, 2, 3, 4, 5, 6, 7, 8, 9),
                         labels = c("<30k", "30k-45k", "45k-60k", "60k-75k", "75k-90k", "90k-105", "105k-120k", ">120k", "Don't know")))
```

```
table(df$Income)
```

```
##
##      <30k      30k-45k      45k-60k      60k-75k      75k-90k      90k-105      105k-120k
##      153          179          241          179          190          254
##      203
##      >120k Don't know
##      240          861
```

We wanted to treat Income level as an ordinal variable. However, since there are a large number of records(861 out of 2500) that have Income as “Dont know”, we decided to treat it as nominal variable.

Variable Tenancy

```
table(df$Tenancy)
```

```
##
##      1      2      3      4      5
## 2012  430   12   38      8
```

Converting the Tenancy column to nominal column

```
df <- df %>%
  mutate(Tenancy = factor(Tenancy, levels = c(1, 2, 3, 4, 5),
                           labels = c("Own", "Rent", "Other", "Neither",
                                       "Don't know")))
```

```
table(df$Tenancy)
```

```
##
##      Own      Rent      Other      Neither Don't know
##    2012     430       12       38          8
```

Variable Years_in_yc

```
table(df$Years_in_yc)
```

```
##
##      1      2      3      4      5      6      7      8      9     10     11     12
## 112 146 195 228 302 202 230 182 250 165 479      9
```

```
#df <- df %>% mutate(Years_in_yc = ifelse(Years_in_yc == 12,
11, Years_in_yc))
```

```
#table(df$Years_in_yc)
```

```
df <- df %>%
  mutate(Years_in_yc = factor(Years_in_yc,
                              levels = c(1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11,
12),
                              labels = c("< 5 years", "5 to <10 years", "10
to <15 years",
                                       "15 to <20 years", "20 to <25
years", "25 to <30 years",
                                       "30 to <35 years", "35 to <40
years", "40 to <45 years",
                                       "45 to <50 years", "50 years or
more", "Prefer not to answer"),
                              ordered = TRUE))
```



```
table(df$Years_in_yc)
```

```
##
##          < 5 years      5 to <10 years      10 to <15 years
##             112             146             195
##      15 to <20 years      20 to <25 years      25 to <30 years
##             228             302             202
##      30 to <35 years      35 to <40 years      40 to <45 years
##             230             182             250
##      45 to <50 years      50 years or more Prefer not to answer
##             165             479             9
```

```
mode_value <- sort(table(df$Years_in_yc), decreasing = TRUE)[1]
mode_value
```

```
## 50 years or more
##             479
```

Variable Education

```
table(df$Education)
```

```
##
##    1    2    3    4
## 378 879 1160  83
```

```
df <- df %>% mutate(Education = factor(Education,
                                       levels = c(1,2,3,4),
                                       labels = c("High School or less", "
Post Secondary or College Diploma", "University or PG degree", "Don't
know")))
```

level 4 = “Dont know” and there are 83 such records. As somebody with a university degree or a pg degree would not be answering “Dont know” we decided against making this variable ordinal, choosing nominal instead.

```
table(df$Education)
```

```
##
##          High School or less      Post Secondary or College Diploma
##                378                879
##      University or PG degree      Don't know
##                1160                83
```

Variable Children

```
table(df$Children)
```

```
##
##    1    2    3
## 672 1821  7
```

```
df <- df %>% mutate(Children = factor(Children,
                                     levels = c(1,2,3),
                                     labels = c("Yes", "No",
" Don't know"))))
table(df$Children)

##
##      Yes      No Don't know
##      672     1821         7
```

Variable Minority

```
table(df$Minority)

##
##      1      2      3
##  477 1947   76

df <- df %>% mutate(Minority = factor(Minority,
                                     levels = c(1,2,3),
                                     labels = c("Yes", "No", "Don't know"))))

table(df$Minority)

##
##      Yes      No Don't know
##      477     1947         76
```

Variable Gender

```
table(df$Gender)

##
##      1      2      3      7
## 1314 1170      8      8

df <- df %>% mutate(Gender = factor(Gender,
                                     levels = c(1,2,3, 7),
                                     labels = c("Yes", "No", "Other", "Prefer
not to answer"))))

table(df$Gender)

##
##              Yes              No              Other
##           1314           1170              8
## Prefer not to answer
##              8
```

Variable Age

```
table(df$Age)
```

```
##
## 1 2 3 4 5 6 7
## 148 225 381 416 496 784 50

df <- df %>%
  mutate(Age = factor(Age,
    levels = c(1, 2, 3, 4, 5, 6, 7),
    labels = c("18-24 years", "25-34 years", "35-44 years",
      "45-54 years", "55-64years", "65+ years",
      "Prefer not to answer")))

table(df$Age)

##
##      18-24 years      25-34 years      35-44 years
##           148           225           381
##      45-54 years      55-64years      65+ years
##           416           496           784
## Prefer not to answer
##           50

str(df)

## 'data.frame': 2500 obs. of 10 variables:
## $ Quadrant : Factor w/ 4 levels "SW","SE","NW",...: 4 1 2 3 1 1 1
## 2 1 1 ...
## $ Income : Factor w/ 9 levels "<30k","30k-45k",...: 4 1 7 9 4 1
## 4 7 9 2 ...
## $ Tenancy : Factor w/ 5 levels "Own","Rent","Other",...: 1 1 1 1
## 1 2 1 1 1 1 ...
## $ Years_in_yc : Ord.factor w/ 12 levels "< 5 years"<"5 to <10
## years"<...: 9 9 8 8 10 1 11 8 3 7 ...
## $ Education : Factor w/ 4 levels "High School or less",...: 3 2 2
## 3 2 3 3 2 2 3 ...
## $ Children : Factor w/ 3 levels "Yes","No","Don't know": 2 2 2 2
## 2 2 2 2 1 2 ...
## $ Minority : Factor w/ 3 levels "Yes","No","Don't know": 2 2 2 3
## 2 1 2 2 2 2 ...
## $ Gender : Factor w/ 4 levels "Yes","No","Other",...: 1 2 1 1 1
## 2 1 1 1 1 ...
## $ Age : Factor w/ 7 levels "18-24 years",...: 6 6 6 6 5 6 6
## 5 4 6 ...
## $ Satisfaction_level: int 6 6 8 7 8 7 7 10 8 5 ...

df <- df %>%
  mutate(Satisfaction = factor(ifelse(Satisfaction_level > 5, "Yes", "No"),
    levels = c("No", "Yes")))

table(df$Satisfaction)
```

```
##
##   No   Yes
## 319 2181

sum(table(df$Satisfaction))

## [1] 2500

Age_Satis <- table(df$Age, df$Satisfaction)
Age_Satis

##
##               No Yes
## 18-24 years      8 140
## 25-34 years     14 211
## 35-44 years     35 346
## 45-54 years     54 362
## 55-64years     72 424
## 65+ years     122 662
## Prefer not to answer 14 36

chisq.test(Age_Satis)

##
## Pearson's Chi-squared test
##
## data:  Age_Satis
## X-squared = 37.553, df = 6, p-value = 1.374e-06
```

P value is less than 0.05, we reject the null hypothesis and conclude that Age and Satisfaction are dependent

```
Income_Satis <- table(df$Income, df$Satisfaction)
Income_Satis

##
##               No Yes
## <30k          37 116
## 30k-45k       26 153
## 45k-60k       27 214
## 60k-75k       22 157
## 75k-90k       21 169
## 90k-105       26 228
## 105k-120k     14 189
## >120k         25 215
## Don't know   121 740

chisq.test(Income_Satis)

##
## Pearson's Chi-squared test
##
```

```
## data: Income_Satis
## X-squared = 29.694, df = 8, p-value = 0.0002394

Gender_Satis <- table(df$Gender, df$Satisfaction)
Gender_Satis

##
##              No  Yes
##   Yes          193 1121
##   No           122 1048
##   Other           2    6
##   Prefer not to answer  2    6

chisq.test(Gender_Satis)

## Warning in chisq.test(Gender_Satis): Chi-squared approximation may be
incorrect

##
## Pearson's Chi-squared test
##
## data: Gender_Satis
## X-squared = 12.26, df = 3, p-value = 0.006544

Years_Satis <- table(df$Years_in_yc, df$Satisfaction)
Years_Satis

##
##              No  Yes
##   < 5 years          6 106
##   5 to <10 years     10 136
##   10 to <15 years     21 174
##   15 to <20 years     22 206
##   20 to <25 years     29 273
##   25 to <30 years     29 173
##   30 to <35 years     27 203
##   35 to <40 years     22 160
##   40 to <45 years     44 206
##   45 to <50 years     24 141
##   50 years or more    84 395
##   Prefer not to answer  1    8

chisq.test(Years_Satis)

##
## Pearson's Chi-squared test
##
## data: Years_Satis
## X-squared = 31.801, df = 11, p-value = 0.0008208

Education_Satis <- table(df$Education, df$Satisfaction)
Education_Satis
```

```
##
##
##           No  Yes
##   High School or less      60  318
##   Post Secondary or College Diploma  134  745
##   University or PG degree    102 1058
##   Don't know                23   60

chisq.test(Education_Satis)

##
##   Pearson's Chi-squared test
##
## data:  Education_Satis
## X-squared = 41.23, df = 3, p-value = 5.845e-09

Quadrant_Satis <- table(df$Quadrant, df$Satisfaction)
Quadrant_Satis

##
##           No  Yes
##   SW    80  579
##   SE    84  519
##   NW    77  644
##   NE    78  439

chisq.test(Quadrant_Satis)

##
##   Pearson's Chi-squared test
##
## data:  Quadrant_Satis
## X-squared = 6.288, df = 3, p-value = 0.09841

Children_Satis <- table(df$Children, df$Satisfaction)
Children_Satis

##
##           No  Yes
##   Yes           66  606
##   No          248 1573
##   Don't know    5    2

chisq.test(Children_Satis)

## Warning in chisq.test(Children_Satis): Chi-squared approximation may be
## incorrect

##
##   Pearson's Chi-squared test
##
## data:  Children_Satis
## X-squared = 28.064, df = 2, p-value = 8.054e-07
```

```

Minority_Satis <- table(df$Minority, df$Satisfaction)
Minority_Satis

##
##           No  Yes
##  Yes       47  430
##  No       253 1694
##  Don't know   19   57

chisq.test(Minority_Satis)

##
##  Pearson's Chi-squared test
##
## data:  Minority_Satis
## X-squared = 13.945, df = 2, p-value = 0.0009373

Tenancy_Satis <- table(df$Tenancy, df$Satisfaction)
Tenancy_Satis

##
##           No  Yes
##  Own       255 1757
##  Rent       54  376
##  Other        1   11
##  Neither       5   33
##  Don't know    4    4

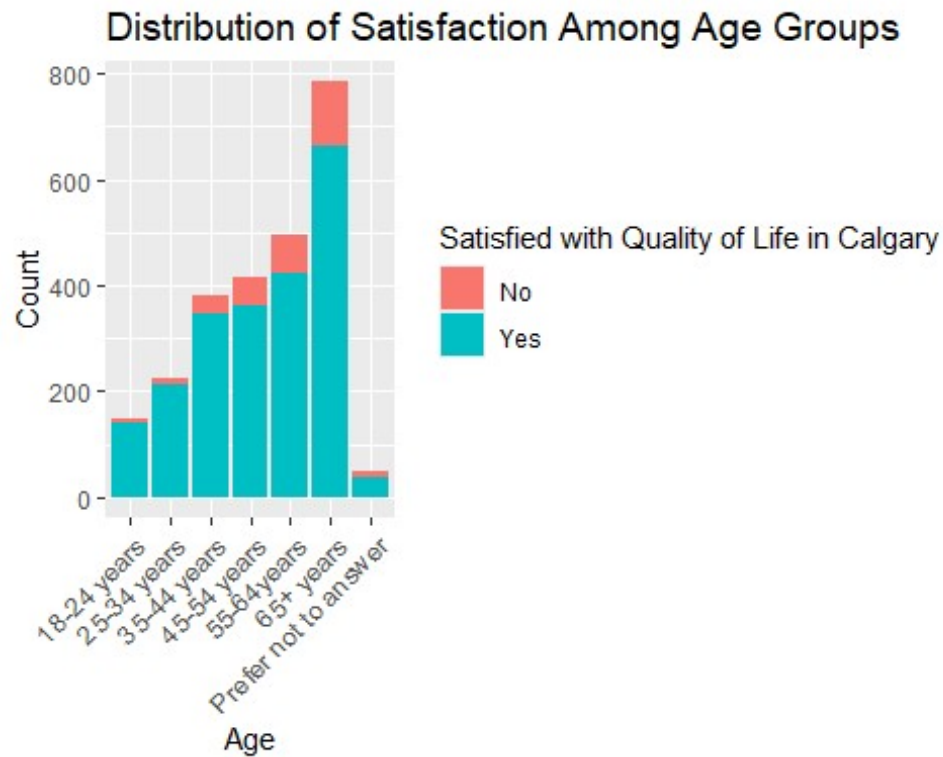
chisq.test(Tenancy_Satis)

## Warning in chisq.test(Tenancy_Satis): Chi-squared approximation may be
## incorrect

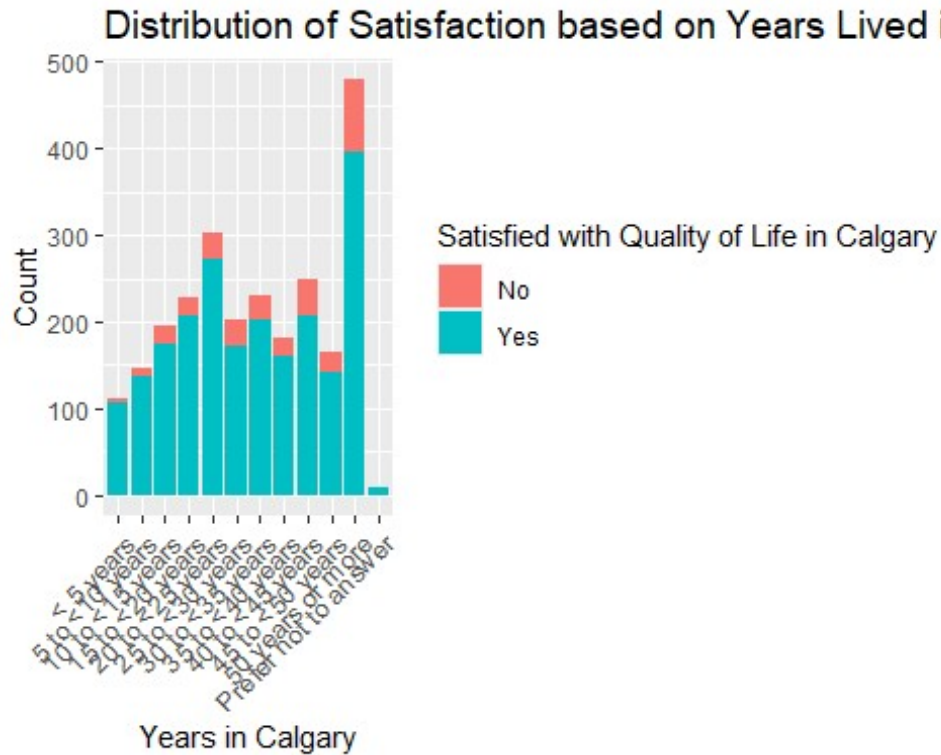
##
##  Pearson's Chi-squared test
##
## data:  Tenancy_Satis
## X-squared = 10.212, df = 4, p-value = 0.037

ggplot(df, aes(x=Age, fill=Satisfaction)) +
  geom_bar() +
  xlab("Age") +
  ylab("Count") +
  ggtitle("Distribution of Satisfaction Among Age Groups") +
  scale_fill_discrete(name = "Satisfied with Quality of Life in Calgary",
labels = c("No", "Yes"))+
  theme(plot.title = element_text(size = 14),
        axis.text.x = element_text(angle = 45, hjust = 1, size = 10))

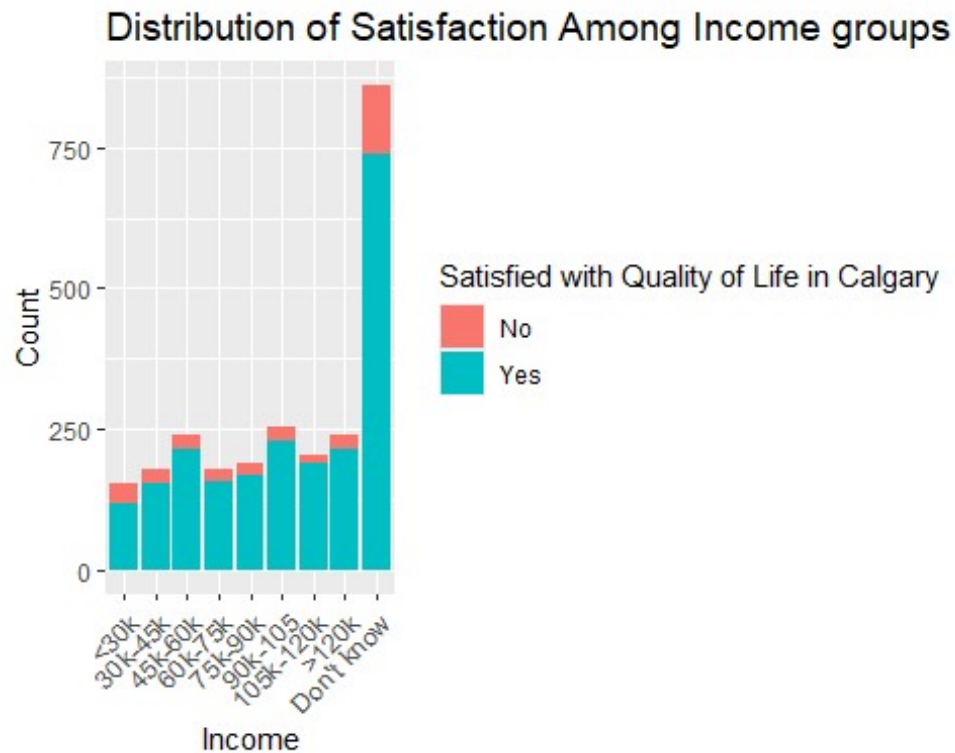
```



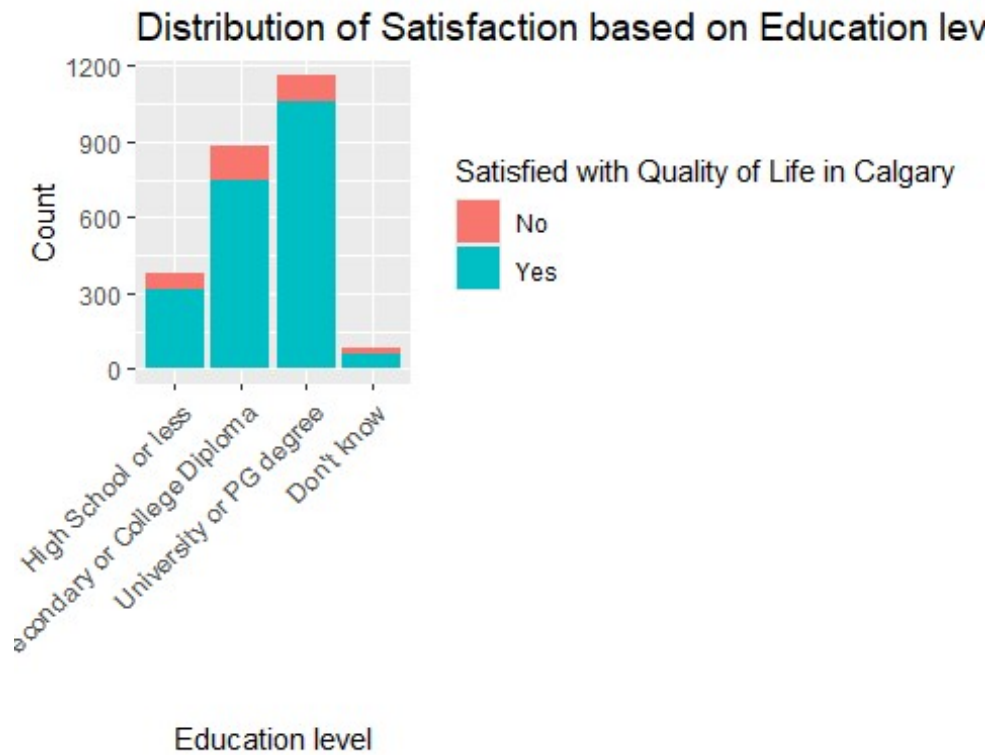
```
ggplot(df, aes(x=Years_in_yc, fill=Satisfaction)) +
  geom_bar() +
  xlab("Years in Calgary") +
  ylab("Count") +
  ggtitle("Distribution of Satisfaction based on Years Lived in Calgary") +
  scale_fill_discrete(name = "Satisfied with Quality of Life in Calgary",
    labels = c("No", "Yes"))+
  theme(plot.title = element_text(size = 14),
    axis.text.x = element_text(angle = 45, hjust = 1, size = 10))
```

```
ggplot(df, aes(x=Income, fill=Satisfaction)) +
  geom_bar() +
  xlab("Income") +
  ylab("Count") +
  ggtitle("Distribution of Satisfaction Among Income groups") +
  scale_fill_discrete(name = "Satisfied with Quality of Life in Calgary",
    labels = c("No", "Yes"))+
  theme(plot.title = element_text(size = 14),
    axis.text.x = element_text(angle = 45, hjust = 1, size = 10))
```

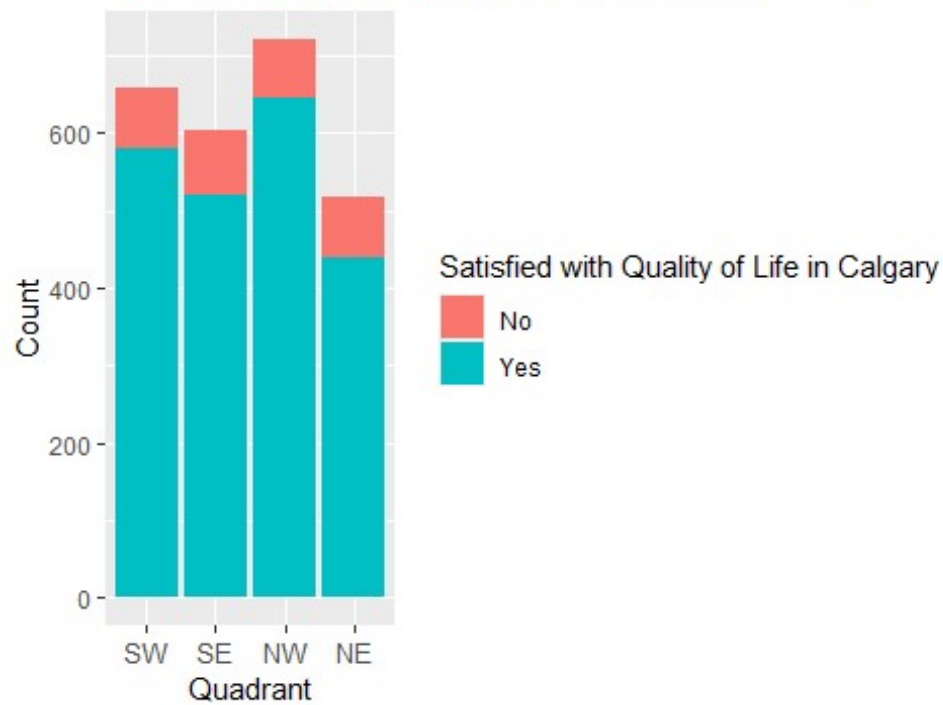


```
ggplot(df, aes(x=Education, fill=Satisfaction)) +
  geom_bar() +
  xlab("Education level") +
  ylab("Count") +
  ggtitle("Distribution of Satisfaction based on Education level") +
  scale_fill_discrete(name = "Satisfied with Quality of Life in Calgary",
    labels = c("No", "Yes"))+
  theme(plot.title = element_text(size = 14),
    axis.text.x = element_text(angle = 45, hjust = 1, size = 10))
```

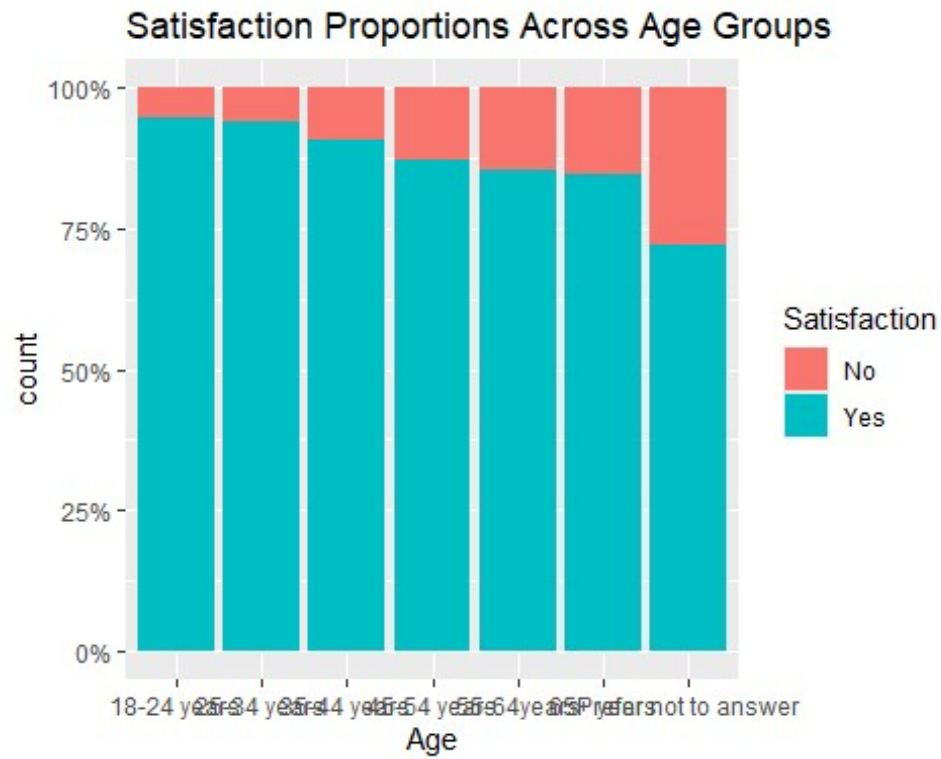


```
ggplot(df, aes(x=Quadrant, fill=Satisfaction)) +
  geom_bar() +
  xlab("Quadrant") +
  ylab("Count") +
  ggtitle("Distribution of Satisfaction Across Quadrants") +
  scale_fill_discrete(name = "Satisfied with Quality of Life in Calgary",
    labels = c("No", "Yes"))+
  theme(plot.title = element_text(size = 14),
    axis.text.x = element_text(angle = 0, size = 10))
```

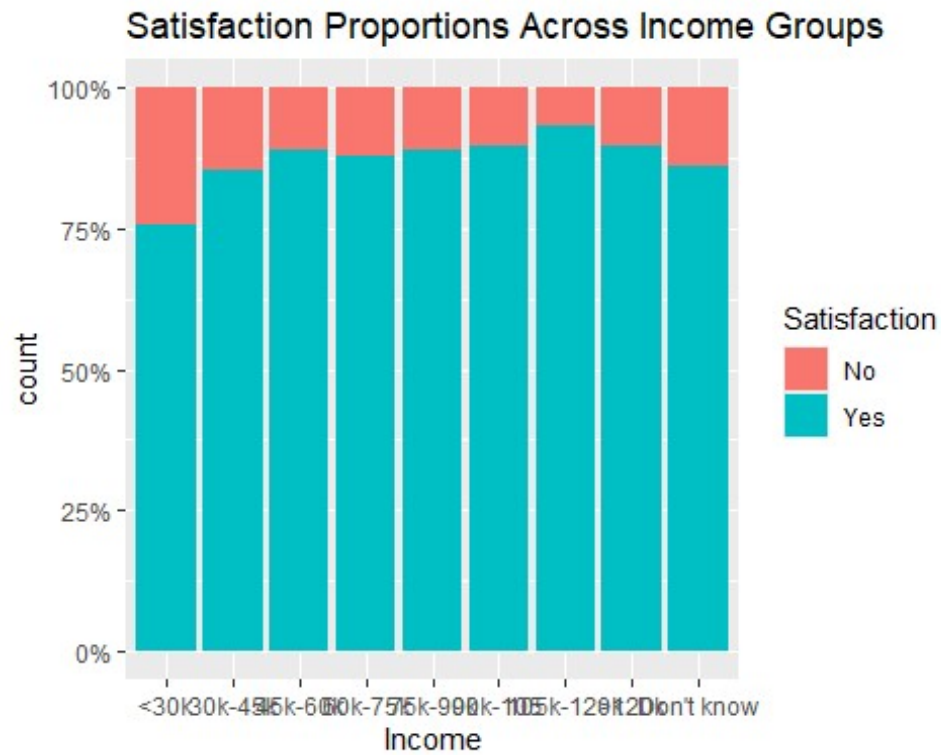
Distribution of Satisfaction Across Quadrants



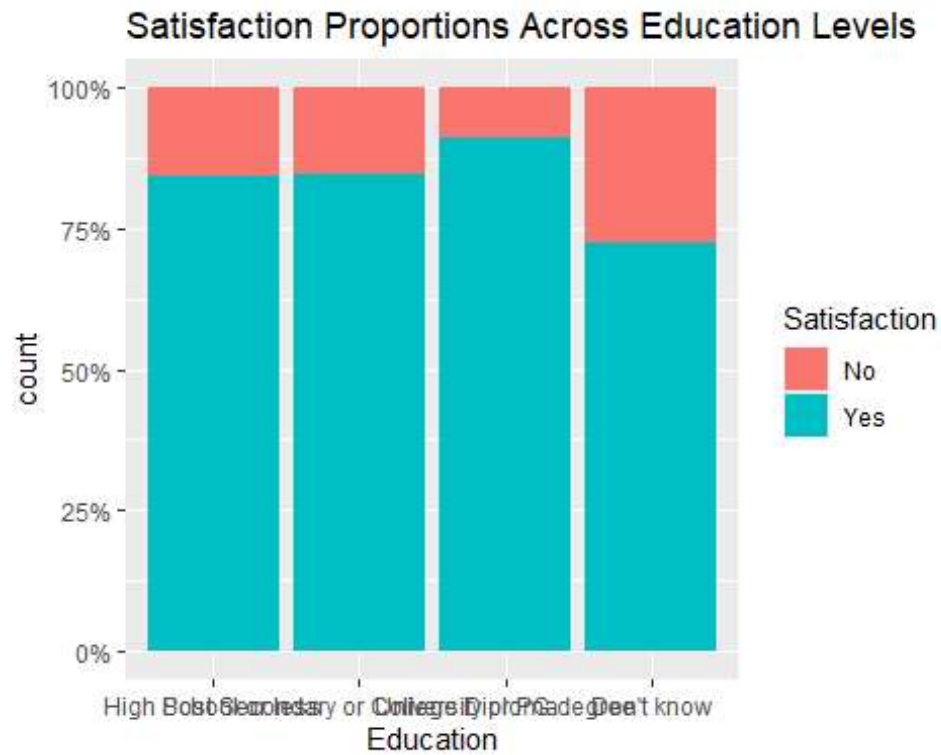
```
ggplot(df, aes(x = Age, fill = Satisfaction)) +  
  geom_bar(position = "fill") +  
  scale_y_continuous(labels = scales::percent_format()) +  
  ggtitle("Satisfaction Proportions Across Age Groups")
```



```
ggplot(df, aes(x = Income, fill = Satisfaction)) +
  geom_bar(position = "fill") +
  scale_y_continuous(labels = scales::percent_format()) +
  ggtitle("Satisfaction Proportions Across Income Groups")
```



```
ggplot(df, aes(x = Education, fill = Satisfaction)) +
  geom_bar(position = "fill") +
  scale_y_continuous(labels = scales::percent_format()) +
  ggtitle("Satisfaction Proportions Across Education Levels")
```



```
ggplot(df, aes(x = Years_in_yc, fill = Satisfaction)) +
  geom_bar(position = "fill") +
  scale_y_continuous(labels = scales::percent_format()) +
  ggtitle("Satisfaction Proportions Across Years lived in Calgary") +
  theme(plot.title = element_text(size = 14),
        axis.text.x = element_text(angle = 45, hjust = 1, size = 10))
```

Satisfaction Proportions Across Years lived in Cal

