# Intern\_Assessment\_Rawan\_Hammad

#### Rawan Hammad

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This R-Markdown file will guide you through my method of recreating the summary statistics of the credit card types, current credit limits, and product types of higher risk, typical, and lower risk hypothetical credit card accounts.

In the first step of this analysis, I imported all the libraries I will likely need.

```
library(tidyr)
library(knitr)
library(readxl)
library(tidyverse)
library(dplyr)
library(gtsummary)
```

Next, I imported the three hypothetical datasets provided.

```
#importing the high risk cardholder file
cards_high_risk_2021 <- read.csv("C:/Users/rawan/OneDrive/Desktop/DePaul/Job
Assessments/Federal Reserve/cards-high-risk-2021.csv")

#importing the low risk cardholder file
cards_low_risk_2021 <- read.csv("C:/Users/rawan/OneDrive/Desktop/DePaul/Job
Assessments/Federal Reserve/cards-low-risk-2021.csv")

#importing the typical risk cardholder file
cards_typical_risk_2021 <-
read.csv("C:/Users/rawan/OneDrive/Desktop/DePaul/Job Assessments/Federal
Reserve/cards-typical-risk-2021.csv")</pre>
```

Now, it wouldn't be a bad idea to use the built-in summary function to view the data.

Let's first view the high risk dataset.

```
summary(cards_high_risk_2021)
                   accountoriginationyear
##
      loan id
                                           activeflag
                                                        borrowerincome
## Min.
         : 1.00
                   Min.
                          :2003
                                         Min.
                                                :0.000
                                                        Min. :
## 1st Qu.: 50.75
                   1st Qu.:2013
                                         1st Qu.:0.000
                                                        1st Qu.: 21133
## Median :100.50
                   Median :2016
                                         Median :0.000
                                                        Median : 50785
                                                              : 81009
## Mean
        :100.50
                   Mean :2015
                                         Mean
                                               :0.025
                                                        Mean
## 3rd Qu.:150.25
                   3rd Qu.:2018
                                         3rd Qu.:0.000
                                                        3rd Ou.:108955
## Max.
          :200.00
                   Max.
                          :2019
                                         Max.
                                               :1.000
                                                        Max.
                                                              :395760
## creditcardtype currentcreditlimit cycleendingbalance cycleendingretailapr
## Min. :1.00 Min. : 220
                                   Min. : 20
                                                     Min. : 0.37
```

```
1st Ou.:1.00
                  1st Ou.: 1332
                                     1st Ou.: 695
                                                        1st Ou.:13.11
##
   Median :1.00
                  Median : 2650
                                     Median : 1510
                                                        Median :18.84
         :1.17
                        : 3554
##
   Mean
                  Mean
                                     Mean
                                            : 2240
                                                        Mean
                                                               :18.14
##
   3rd Qu.:1.00
                  3rd Qu.: 4522
                                     3rd Qu.: 2932
                                                        3rd Qu.:23.82
##
   Max.
          :2.00
                  Max.
                         :22080
                                     Max.
                                            :11050
                                                        Max.
                                                               :29.94
##
                     monthendclosedrevokedflag originalcreditlimit
    dayspastdue
   Min. : 0.000
                     Min.
                            :0.000
                                               Min.
                                                    : 100.0
##
   1st Qu.: 0.000
                     1st Qu.:0.000
                                               1st Qu.:
                                                         517.5
##
   Median : 0.000
                     Median :0.000
                                               Median : 1120.0
##
   Mean
         : 4.675
                     Mean
                            :0.025
                                               Mean
                                                      : 2018.4
##
   3rd Qu.: 0.000
                     3rd Qu.:0.000
                                               3rd Qu.: 2422.5
## Max.
          :164.000
                     Max. :1.000
                                               Max.
                                                      :20920.0
##
    producttype
                   refreshedcreditscoreprimaryborrower
## Min.
          :1.000
                   Min.
                          :450.0
                   1st Qu.:602.0
##
   1st Qu.:2.000
                   Median :649.0
   Median :2.000
## Mean
         :1.895
                   Mean
                          :635.2
##
   3rd Qu.:2.000
                   3rd Qu.:677.0
## Max. :2.000
                   Max. :699.0
```

#### The low risk dataset:

```
summary(cards_low_risk_2021)
##
      loan id
                                             activeflag borrowerincome
                    accountoriginationyear
## Min.
         : 1.00
                    Min. :2000
                                           Min.
                                                  :0
                                                        Min.
                                                              :
##
   1st Qu.: 50.75
                    1st Qu.:2011
                                           1st Qu.:0
                                                        1st Qu.: 18078
                                           Median :0
##
   Median :100.50
                    Median :2014
                                                       Median : 47730
## Mean
         :100.50
                    Mean :2013
                                           Mean :0
                                                       Mean : 91745
                                                        3rd Qu.:125095
##
   3rd Qu.:150.25
                    3rd Qu.:2017
                                           3rd Qu.:0
##
   Max.
          :200.00
                    Max.
                           :2019
                                           Max.
                                                 :0
                                                        Max.
                                                              :459850
##
   creditcardtype currentcreditlimit cycleendingbalance cycleendingretailapr
                                                       Min. : 1.01
##
   Min.
         :1.00
                        : 460
                  Min.
                                     Min.
                                          :
                                               40
##
   1st Qu.:1.00
                  1st Qu.: 4262
                                     1st Qu.: 470
                                                        1st Qu.:11.93
##
   Median :1.00
                  Median : 8110
                                     Median : 1510
                                                       Median :15.97
##
   Mean
         :1.12
                  Mean
                        : 9124
                                     Mean
                                          : 2908
                                                       Mean
                                                               :15.96
##
   3rd Qu.:1.00
                  3rd Qu.:12358
                                     3rd Qu.: 3870
                                                        3rd Qu.:20.89
## Max.
          :2.00
                  Max.
                         :32460
                                     Max.
                                           :18690
                                                       Max.
                                                               :29.95
##
    dayspastdue
                  monthendclosedrevokedflag originalcreditlimit producttype
## Min.
          :0.00
                                            Min.
                                                      140
                                                               Min.
                  Min.
                         :0
                                                   :
:1.000
## 1st Qu.:0.00
                  1st Qu.:0
                                            1st Qu.: 2245
                                                                1st
Qu.:2.000
## Median :0.00
                  Median :0
                                            Median : 4135
                                                               Median
:2.000
## Mean
          :0.07
                  Mean
                         :0
                                            Mean
                                                   : 6096
                                                               Mean
:1.835
## 3rd Qu.:0.00
                                            3rd Qu.: 7685
                  3rd Qu.:0
                                                                3rd
Qu.:2.000
## Max. :6.00
                  Max. :0
                                            Max. :29920
                                                               Max.
```

```
:2.000
## refreshedcreditscoreprimaryborrower
## Min. :700.0
## 1st Qu.:729.0
## Median :763.5
## Mean :765.4
## 3rd Qu.:798.0
## Max. :850.0
```

### And the typical risk dataset:

```
summary(cards_typical_risk_2021)
```

```
accountoriginationyear
                                              activeflag borrowerincome
##
       loan id
## Min.
         : 1.00
                     Min.
                            :2003
                                            Min.
                                                   :0
                                                         Min.
                                                               :
   1st Qu.: 50.75
                     1st Qu.:2011
                                            1st Qu.:0
                                                         1st Qu.: 16168
##
## Median :100.50
                     Median :2015
                                            Median :0
                                                         Median : 55445
## Mean
                                                                : 84045
         :100.50
                     Mean
                            :2014
                                            Mean
                                                   :0
                                                         Mean
## 3rd Qu.:150.25
                     3rd Qu.:2018
                                            3rd Qu.:0
                                                         3rd Qu.:113578
## Max.
           :200.00
                     Max.
                            :2019
                                            Max.
                                                   :0
                                                         Max.
                                                                :489080
## creditcardtype
                    currentcreditlimit cycleendingbalance
cycleendingretailapr
## Min.
                           : 280
                                       Min.
                                                  20
          :1.000
                    Min.
                                                          Min.
                                                                 : 0.84
## 1st Qu.:1.000
                    1st Qu.: 2212
                                       1st Qu.: 495
                                                          1st Qu.:10.86
## Median :1.000
                    Median : 4780
                                       Median : 1205
                                                          Median :14.46
## Mean
           :1.115
                    Mean
                           : 6463
                                       Mean
                                              : 2547
                                                          Mean
                                                                 :15.10
## 3rd Qu.:1.000
                    3rd Qu.: 8802
                                       3rd Qu.: 3055
                                                          3rd Qu.:20.26
## Max.
           :2.000
                    Max.
                           :28620
                                       Max.
                                              :20660
                                                          Max.
                                                                 :29.81
##
     dayspastdue
                     monthendclosedrevokedflag originalcreditlimit
producttype
                                                          90.0
## Min.
              0.00
                     Min.
                            :0
                                               Min.
                                                                   Min.
:1.00
                     1st Qu.:0
## 1st Qu.:
              0.00
                                               1st Qu.: 927.5
                                                                   1st
Qu.:2.00
                     Median :0
                                               Median : 2375.0
## Median :
             0.00
                                                                   Median
:2.00
## Mean
           : 4.56
                     Mean
                            :0
                                               Mean
                                                      : 4444.1
                                                                   Mean
:1.85
                                               3rd Qu.: 5877.5
## 3rd Qu.: 0.00
                     3rd Qu.:0
                                                                   3rd
Qu.:2.00
## Max.
                                                                   Max.
           :172.00
                     Max.
                            :0
                                               Max.
                                                      :26930.0
:2.00
## refreshedcreditscoreprimaryborrower
## Min.
           :450.0
## 1st Qu.:649.5
## Median :709.0
## Mean
          :701.7
## 3rd Qu.:780.5
## Max. :848.0
```

We can see that all the variables match/overlap and there is no missing data in all three files. We can now create a summary of the three variables we're interested in: credit card types, current credit limit, and the product type. However, since the provided values for all these options are numerical, yet the output summary requires a categorical description, I've decided to bin a few values.

Now I'd like to take a minute to explain why I'm binning these values. I'm using a built-in function within the gtsummary library to create this summary. It is fast and efficient, and will provide us with all the data we need.

```
#creating a dataframe called highs and only including the credit card type,
credit limit, and product type
highs <- cards_high_risk_2021 %>% select(creditcardtype, currentcreditlimit,
producttype)

#the tbl summary is the built-in function within gtsummary that creates the
summary below
highs %>% tbl_summary()

## Table printed with {flextable}, not {gt}. Learn why at
## http://www.danieldsjoberg.com/gtsummary/articles/rmarkdown.html
## To suppress this message, include `message = FALSE` in the code chunk
header.
```

Characteristic	$N = 200^{1}$
creditcardtype	
1	166 (83%)
2	34 (17%)
currentcreditlimit	2,650 (1,332, 4,522)
producttype	
1	21 (10%)
2	179 (90%)

<sup>1</sup>n (%); Median (IQR)

Based on the summary above, we're given percentages that match those in the example provided. However, we are not given any details on what the 1 and 2 values in product type and credit card type are. We also don't know what the current credit limit data is really telling us. This is why we need to bin the data.

Let's continue working with the higher risk file.

First, let's bin the credit limits:

```
#create a new data frame for the high risk data
high_risk <- cards_high_risk_2021

#create a new column for the binned credit limit
high_risk$"Current Credit Limit" <- high_risk$currentcreditlimit

#bin names
bin_names <- c("$1500 and less", "$1501-$7500", "over $7500")

#bin limits
bin_limits
bin_limits <- c(-Inf, 1501, 7500, Inf)

#implement the binning
high_risk$"Current Credit Limit" <- cut(high_risk$"Current Credit Limit",
breaks = bin_limits, labels = bin_names)</pre>
```

Next, we'll use the same method to rename 1's and 2's in credit card type and product type (by basically binning them):

```
#CREDIT CARD TYPE
#create a new column for the binned credit card type
high_risk$"Credit Card Type" <- high_risk$creditcardtype</pre>
#bin names
bin_names <- c("General Purpose", "Private Label")</pre>
#bin limits
bin_limits \leftarrow c(0,1,2)
#implement the binning
high_risk$"Credit Card Type" <- cut(high_risk$"Credit Card Type", breaks =</pre>
bin limits, labels = bin names)
#PRODUCT TYPE
#create a new column for the binned product type
high_risk$"Product Type" <- high_risk$producttype</pre>
#bin names
bin names <- c("Co-brand", "Other")</pre>
#bin Limits
bin_limits \leftarrow c(0,1,2)
#implement the binning
```

```
high_risk$"Product Type" <- cut(high_risk$"Product Type", breaks =
bin_limits, labels = bin_names)</pre>
```

We are now ready to view our final summary for the higher risk credit card accounts.

```
#create a new dataframe
highs <- high_risk %>% select("Credit Card Type", "Current Credit Limit",
"Product Type")

#now create the summary
highs <- highs %>% tbl_summary(digits = list(all_categorical() ~ c(0, 1)))
%>%
    modify_header(label ~ "**Variables**") %>%
    modify_caption("**Table 1. Summary Statistics of Hypothetical Higher-Risk
Credit Card Accounts**") %>%
    bold_labels()
highs

## Table printed with {flextable}, not {gt}. Learn why at
## http://www.danieldsjoberg.com/gtsummary/articles/rmarkdown.html
## To suppress this message, include `message = FALSE` in the code chunk
header.
```

Table 1. Summary Statistics of Hypothetical Higher-Risk Credit Card Accounts

Variables	$N = 200^{1}$
Credit Card Type	
General Purpose	166 (83.0%)
Private Label	34 (17.0%)
Current Credit Limit	
\$1500 and less	60 (30.0%)
\$1501-\$7500	121 (60.5%)
over \$7500	19 (9.5%)
Product Type	
Co-brand	21 (10.5%)
Other	179 (89.5%)
¹n (%)	

We'll follow the same steps above to create a similar summary for the lower and typical risks.

Lower Risk credit cardholders:

```
#CURRENT CREDIT LIMIT
#create a new data frame for the high risk csv data
low risk <- cards low risk 2021</pre>
#create a new column for the binned credit limit
low_risk$"Current Credit Limit" <- low_risk$currentcreditlimit</pre>
#bin names
bin names <- c("$1500 and less", "$1501-$7500", "over $7500")
#bin limits
bin_limits <- c(-Inf, 1501, 7500, Inf)
#implement the binning
low_risk$"Current Credit Limit" <- cut(low_risk$"Current Credit Limit",</pre>
breaks = bin_limits, labels = bin_names)
#CREDIT CARD TYPE
#create a new column for the binned credit card type
low risk$"Credit Card Type" <- low risk$creditcardtype</pre>
#bin names
bin_names <- c("General Purpose", "Private Label")</pre>
#bin limits
bin_limits \leftarrow c(0,1,2)
#implement the binning
low risk$"Credit Card Type" <- cut(low_risk$"Credit Card Type", breaks =</pre>
bin limits, labels = bin names)
#PRODUCT TYPE
#create a new column for the binned product type
low risk$"Product Type" <- low risk$producttype</pre>
#bin names
bin_names <- c("Co-brand", "Other")</pre>
```

```
#bin limits
bin_limits \leftarrow c(0,1,2)
#implement the binning
low_risk$"Product Type" <- cut(low_risk$"Product Type", breaks = bin_limits,</pre>
labels = bin names)
#create a new dataframe
lows <- low_risk %>% select("Credit Card Type", "Current Credit Limit",
"Product Type")
#now create the summary
lows <- lows %>% tbl_summary(digits = list(all_categorical() ~ c(0, 1))) %>%
  modify_header(label ~ "**Variables**") %>%
  modify caption("**Table 2. Summary Statistics of Hypothetical Lower-Risk
Credit Card Accounts**") %>%
  bold_labels()
lows
## Table printed with {flextable}, not {gt}. Learn why at
## http://www.danieldsjoberg.com/gtsummary/articles/rmarkdown.html
## To suppress this message, include `message = FALSE` in the code chunk
header.
```

Table 2. Summary Statistics of Hypothetical Lower-Risk Credit Card Accounts

Variables	$N = 200^{1}$
Credit Card Type	
General Purpose	176 (88.0%)
Private Label	24 (12.0%)
<b>Current Credit Limit</b>	
\$1500 and less	16 (8.0%)
\$1501-\$7500	75 (37.5%)
over \$7500	109 (54.5%)
Product Type	
Co-brand	33 (16.5%)
Other	167 (83.5%)
4	

<sup>&</sup>lt;sup>1</sup>n (%)

Finally, we'll run this for the typical risk credit card accounts:

```
#CURRENT CREDIT LIMIT
#create a new data frame for the high risk csv data
typical_risk <- cards_typical_risk_2021</pre>
#create a new column for the binned credit limit
typical_risk$"Current Credit Limit" <- typical_risk$currentcreditlimit</pre>
#bin names
bin names <- c("$1500 and less", "$1501-$7500", "over $7500")
#bin limits
bin_limits <- c(-Inf, 1501, 7500, Inf)
#implement the binning
typical_risk$"Current Credit Limit" <- cut(typical_risk$"Current Credit</pre>
Limit", breaks = bin_limits, labels = bin_names)
#CREDIT CARD TYPE
#create a new column for the binned credit card type
typical risk$"Credit Card Type" <- typical risk$creditcardtype
#bin names
bin_names <- c("General Purpose", "Private Label")</pre>
#bin limits
bin_limits \leftarrow c(0,1,2)
#implement the binning
typical_risk$"Credit Card Type" <- cut(typical_risk$"Credit Card Type",</pre>
breaks = bin limits, labels = bin names)
#PRODUCT TYPE
#create a new column for the binned product type
typical risk$"Product Type" <- typical risk$producttype</pre>
#bin names
bin_names <- c("Co-brand", "Other")</pre>
```

```
#bin limits
bin_limits \leftarrow c(0,1,2)
#implement the binning
typical_risk$"Product Type" <- cut(typical_risk$"Product Type", breaks =</pre>
bin limits, labels = bin names)
#create a new dataframe
typicals <- typical_risk %>% select("Credit Card Type", "Current Credit
Limit", "Product Type")
#now create the summary
typicals <- typicals %>% tbl_summary(digits = list(all_categorical() ~ c(0,
1))) %>%
  modify header(label ~ "**Variables**") %>%
  modify_caption("**Table 3. Summary Statistics of Hypothetical Typical-Risk
Credit Card Accounts**") %>%
  bold_labels()
typicals
## Table printed with {flextable}, not {gt}. Learn why at
## http://www.danieldsjoberg.com/gtsummary/articles/rmarkdown.html
## To suppress this message, include `message = FALSE` in the code chunk
header.
```

Table 3. Summary Statistics of Hypothetical Typical-Risk Credit Card Accounts

Variables	$N = 200^{1}$
Credit Card Type	
General Purpose	177 (88.5%)
Private Label	23 (11.5%)
<b>Current Credit Limit</b>	
\$1500 and less	33 (16.5%)
\$1501-\$7500	105 (52.5%)
over \$7500	62 (31.0%)
Product Type	
Co-brand	30 (15.0%)
Other	170 (85.0%)

<sup>&</sup>lt;sup>1</sup>n (%)

Finally, we can show all the tables below for comparison. I tried combining the three tables into 1, but I couldn't get a visually appealing result. Therefore, I decided to maintain the user-friendly results we have below. If you happen to be familiar with a better way to combine these three summaries into one, I'd be happy to discuss it!

Thanks for your time!

FINAL RESULTS BELOW:

#plotting the summaries
highs

Table 1. Summary Statistics of Hypothetical Higher-Risk Credit Card Accounts

Variables	$N = 200^{1}$
Credit Card Type	
General Purpose	166 (83.0%)
Private Label	34 (17.0%)
Current Credit Limit	
\$1500 and less	60 (30.0%)
\$1501-\$7500	121 (60.5%)
over \$7500	19 (9.5%)
Product Type	
Co-brand	21 (10.5%)
Other	179 (89.5%)
¹n (%)	

lows

Table 2. Summary Statistics of Hypothetical Lower-Risk Credit Card Accounts

Variables	$N = 200^{1}$
Credit Card Type	
General Purpose	176 (88.0%)
Private Label	24 (12.0%)
Current Credit Limit	
\$1500 and less	16 (8.0%)
\$1501-\$7500	75 (37.5%)

Variables	$N = 200^{1}$
over \$7500	109 (54.5%)
Product Type	
Co-brand	33 (16.5%)
Other	167 (83.5%)
¹n (%)	

typicals

Table 3. Summary Statistics of Hypothetical Typical-Risk Credit Card Accounts

Variables	$N = 200^{1}$	
Credit Card Type		
General Purpose	177 (88.5%)	
Private Label	23 (11.5%)	
Current Credit Limit		
\$1500 and less	33 (16.5%)	
\$1501-\$7500	105 (52.5%)	
over \$7500	62 (31.0%)	
Product Type		
Co-brand	30 (15.0%)	
Other	170 (85.0%)	

¹n (%)