W203 Lab 1: Candidate Debt EDA

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1. Introduction

1.1 Loading raw dataset

```
CandidateDebt <- read.csv("CandidateDebt.csv",
                          stringsAsFactors = FALSE)
str(CandidateDebt)
```

```
## 'data.frame':    1043 obs. of  28 variables:
##  $ reportnumber       : int  100495995 100496548 100498383 100495987 100496259 100496199 100496375 10
##  $ origin             : chr  "B.3" "B.3" "B.3" "B.3" ...
##  $ filerid            : chr  "RYU C  133" "THOMT  368" "FEY J  422" "STRAS  111" ...
##  $ filertype          : chr  "Candidate" "Candidate" "Candidate" "Candidate" ...
##  $ filername          : chr  "RYU CINDY S" "THOMAS TIMOTHY N JR" "FEY JACOB C" "STRACHAN STEVEN D" .
##  $ firstname          : chr  "CINDY" "TIMOTHY" "JACOB" "STEVEN" ...
##  $ middleinitial      : chr  "S" "N" "C" "D" ...
##  $ lastname           : chr  "RYU" "THOMAS" "FEY" "STRACHAN" ...
##  $ office             : chr  "STATE REPRESENTATIVE" "COUNTY COMMISSIONER" "STATE REPRESENTATIVE" "COU
##  $ legislativedistrict: chr  "STATE SENATOR" "STATE SENATOR" "STATE SENATOR" "STATE SENATOR" ...
##  $ position           : chr  "1" "1" "1" "1" ...
##  $ party              : chr  "" "" "" "" ...
##  $ jurisdiction       : chr  "REPUBLICAN" "REPUBLICAN" "REPUBLICAN" "REPUBLICAN" ...
##  $ jurisdictioncounty : chr  "LEG DISTRICT 01 - SENATE" "LEG DISTRICT 01 - SENATE" "LEG DISTRICT 01 -
##  $ jurisdictiontype   : chr  "KING" "KING" "KING" "KING" ...
##  $ electionyear       : chr  "Legislative" "Legislative" "Legislative" "Legislative" ...
##  $ amount             : chr  "2012" "2012" "2012" "2012" ...
##  $ recordtype         : chr  "283.25" "283.25" "283.25" "283.25" ...
##  $ fromdate           : chr  "DEBT" "DEBT" "DEBT" "DEBT" ...
##  $ thrudate           : chr  "6/1/12" "6/1/12" "6/1/12" "6/1/12" ...
##  $ debtdate           : chr  "7/16/12" "7/16/12" "7/16/12" "7/16/12" ...
##  $ code               : chr  "7/3/12" "7/3/12" "7/3/12" "7/3/12" ...
##  $ description        : chr  "" "" "" "" ...
##  $ vendorname         : chr  "RE-ORDER TEE SHIRTS" "RE-ORDER TEE SHIRTS" "RE-ORDER TEE SHIRTS" "RE-O
##  $ vendoraddress      : chr  "HICKEY GAYLE" "HICKEY GAYLE" "HICKEY GAYLE" "HICKEY GAYLE" ...
##  $ vendorcity         : chr  "PO BOX 2749" "PO BOX 2749" "PO BOX 2749" "PO BOX 2749" ...
##  $ vendorstate        : chr  "WOODINVILLE " "WOODINVILLE " "WOODINVILLE " "WOODINVILLE " ...
##  $ vendorzip          : chr  "WA" "WA" "WA" "WA" ...
```

Problems with target variable *amount*:

```
table(CandidateDebt$amount)
```

```
##
## #N/A 2012
##   56  987
```

Resolution: shift column names:

```
# get column names from row data
var_names <- colnames(read.csv("CandidateDebt.csv", nrows = 1))

# insert column after "position" and remove last column
var_names_corrected <- c(var_names[1:grep("position", var_names)],
                         "position2",
                         var_names[(grep("position", var_names) + 1):(length(var_names) - 1)])
```

Re-loading raw data:

```
# reading the data with correct headers
CandidateDebt <- read.csv("CandidateDebt.csv",
                          stringsAsFactors = FALSE,
                          col.names = var_names_corrected)
rm(list = c("var_names", "var_names_corrected"))
```

Description of data set:

Blah Blah Blah

```
dim(CandidateDebt)
```

```
## [1] 1043   28
```

```
# Converting target variable to numeric
CandidateDebt$amount_num <- as.numeric(CandidateDebt$amount)
summary(CandidateDebt$amount_num)
```

```
##     Min.  1st Qu.   Median     Mean  3rd Qu.     Max.     NA's
##     3.24   283.25   300.00  1347.42  1210.50 19000.00       56
```

1.2 Exploring rows with missing debt data

```
# creating flag for missing values (1 for missing)
CandidateDebt$missing_amount <- ifelse(is.na(CandidateDebt$amount_num), 1, 0)
table(CandidateDebt$missing_amount)
```

```
##
##   0   1
## 987  56
```

While exploring 56 rows with missing data, we discovered that those rows are missing data in all columns except filer name and office they run for. Good news is we are losing only one candidate if we exclude those 56 rows from the analysis. No unique values of *office* variable are among 56 rows.

```
# number of of unique filer ids (candidates in full dataset)
length(unique(CandidateDebt$filerid))
```

```
## [1] 141
```

```
# number of unique filer ids (candidates) in data set without 56 rows with missing data:
length(unique(CandidateDebt[CandidateDebt$missing_amount == 0,]$filerid))
```

```
## [1] 140
```

```
# number of of unique values of office (candidates in full dataset)
length(unique(CandidateDebt$office))
```

```
## [1] 16
```

```r
# number of unique values of office in data set without 56 rows with missing data:
length(unique(CandidateDebt[CandidateDebt$missing_amount == 0,]$office))
```

```
## [1] 16
```

```r
# converting dates from character to dates
CandidateDebt$fromdate <- as.Date(CandidateDebt$fromdate, format = "%m/%d/%y")
CandidateDebt$thrudate <- as.Date(CandidateDebt$thrudate, format = "%m/%d/%y")
CandidateDebt$debtdate <- as.Date(CandidateDebt$debtdate, format = "%m/%d/%y")
```

1.3 Creating analytic dataset

Exlcude variables:

- origin (one value = B.3)
- filertype (one value = Candidate)
- filername, firstname, middleinitial, lastname (will use filerid as a candidate identifier)
- position and position2 (values are not clear and were messed up in raw data)
- electionyear (one value = 2012)
- recordtype (one value = DEBT)

```r
# creating a vector of variables to keep for analysis
keep_vars <- c("reportnumber", "filerid", "filername", "office", "legislativedistrict",
    "party", "jurisdiction", "jurisdictioncounty", "jurisdictiontype",
    "amount_num", "fromdate", "thrudate", "debtdate", "code", "description",
    "vendorname", "vendoraddress","vendorcity", "vendorstate")

# removing 56 rows with missing data
CandidateDebtSub <- CandidateDebt[CandidateDebt$missing_amount == 0,]
CandidateDebtSub <- CandidateDebtSub[keep_vars]
rm(keep_vars)
```

Looking at main analytic dataset:

```r
summary(CandidateDebtSub)
```

```
##   reportnumber         filerid           filername
##  Min.   :100346104   Length:987         Length:987
##  1st Qu.:100446276   Class :character   Class :character
##  Median :100471547   Mode  :character   Mode  :character
##  Mean   :100466089
##  3rd Qu.:100494036
##  Max.   :100599472
##     office          legislativedistrict    party
##  Length:987         Length:987          Length:987
##  Class :character   Class :character    Class :character
##  Mode  :character   Mode  :character    Mode  :character
##
##
##
##  jurisdiction       jurisdictioncounty jurisdictiontype
##  Length:987         Length:987         Length:987
##  Class :character   Class :character   Class :character
```

```
##  Mode  :character   Mode  :character   Mode  :character
##
##
##
##    amount_num          fromdate             thrudate
##  Min.   :    3.24   Min.   :2009-10-01   Min.   :2009-10-31
##  1st Qu.:  283.25   1st Qu.:2011-10-01   1st Qu.:2011-10-31
##  Median :  300.00   Median :2012-02-01   Median :2012-02-29
##  Mean   : 1347.42   Mean   :2011-12-19   Mean   :2012-01-20
##  3rd Qu.: 1210.50   3rd Qu.:2012-06-01   3rd Qu.:2012-07-16
##  Max.   :19000.00   Max.   :2012-08-01   Max.   :2012-08-31
##     debtdate              code           description
##  Min.   :2008-10-29   Length:987         Length:987
##  1st Qu.:2011-07-03   Class :character   Class :character
##  Median :2012-02-29   Mode  :character   Mode  :character
##  Mean   :2011-12-13
##  3rd Qu.:2012-07-03
##  Max.   :2012-08-31
##   vendorname        vendoraddress       vendorcity
##  Length:987         Length:987         Length:987
##  Class :character   Class :character   Class :character
##  Mode  :character   Mode  :character   Mode  :character
##
##
##
##  vendorstate
##  Length:987
##  Class :character
##  Mode  :character
##
##
##
```

```
# checking for presense of missing values
sum(is.na(CandidateDebtSub))
```

```
## [1] 0
```

1.4 Evaluating data quality

Calculating number of unique values per candidate for campaign related variable

```
aggr_office <- aggregate(amount_num ~ filerid + office, data = CandidateDebtSub, sum)
aggr_office <- aggregate(office ~ filerid, data = aggr_office, length)

aggr_legdis <- aggregate(amount_num ~ filerid + legislativedistrict, data = CandidateDebtSub, sum)
aggr_legdis <- aggregate(legislativedistrict ~ filerid, data = aggr_legdis, length)

aggr_party <- aggregate(amount_num ~ filerid + party, data = CandidateDebtSub, sum)
aggr_party <- aggregate(party ~ filerid, data = aggr_party, length)

aggr_jur <- aggregate(amount_num ~ filerid + jurisdiction, data = CandidateDebtSub, sum)
aggr_jur <- aggregate(jurisdiction ~ filerid, data = aggr_jur, length)

aggr_jurc <- aggregate(amount_num ~ filerid + jurisdictioncounty, data = CandidateDebtSub, sum)
```

```
aggr_jurc <- aggregate(jurisdictioncounty ~ filerid, data = aggr_jurc, length)

aggr_jurt <- aggregate(amount_num ~ filerid + jurisdictiontype, data = CandidateDebtSub, sum)
aggr_jurt <- aggregate(jurisdictiontype ~ filerid, data = aggr_jurt, length)

aggr_comb <- cbind(aggr_office,
                   aggr_legdis[,2],
                   aggr_party[,2],
                   aggr_jur[,2],
                   aggr_jurc[,2],
                   aggr_jurt[,2])

colnames(aggr_comb) <- c("filerid", "office", "legislativedistrict", "party", "jurisdiction",
                         "jurisdictioncounty", "jurisdictiontype")
rm(list = c("aggr_office", "aggr_legdis", "aggr_party", "aggr_jur", "aggr_jurc", "aggr_jurt"))

#sapply(aggr_comb[, -1], table)
summary(aggr_comb[, -1])
```

```
##      office  legislativedistrict     party        jurisdiction
##  Min.   :1   Min.   :1.000       Min.   :1.000   Min.   : 1.000
##  1st Qu.:1   1st Qu.:1.000       1st Qu.:1.000   1st Qu.: 2.000
##  Median :1   Median :3.000       Median :2.000   Median : 3.000
##  Mean   :1   Mean   :2.943       Mean   :1.836   Mean   : 4.457
##  3rd Qu.:1   3rd Qu.:4.000       3rd Qu.:2.000   3rd Qu.: 6.250
##  Max.   :1   Max.   :8.000       Max.   :3.000   Max.   :14.000
##  jurisdictioncounty jurisdictiontype
##  Min.   :1.000      Min.   :1.000
##  1st Qu.:1.000      1st Qu.:1.000
##  Median :3.000      Median :2.000
##  Mean   :2.693      Mean   :2.057
##  3rd Qu.:4.000      3rd Qu.:3.000
##  Max.   :6.000      Max.   :4.000
```

Based on the above, we thing all but *office* variables are unreliable

```
# creating flag variables for candidates with more than 1 unique value
aggr_comb$legdist_mult <- ifelse(aggr_comb$legislativedistrict > 1, 1, 0)
aggr_comb$party_mult <- ifelse(aggr_comb$party > 1, 1, 0)
aggr_comb$jur_mult <- ifelse(aggr_comb$jurisdiction > 1, 1, 0)
aggr_comb$jurc_mult <- ifelse(aggr_comb$jurisdictioncounty > 1, 1, 0)
aggr_comb$jurt_mult <- ifelse(aggr_comb$jurisdictiontype > 1, 1, 0)
aggr_comb$mult <- aggr_comb$legdist_mult + aggr_comb$party_mult + aggr_comb$jur_mult +
  aggr_comb$jurc_mult + aggr_comb$jurt_mult
table(aggr_comb$mult)
```

```
##
##  0  1  2  3  4  5
## 34  2  3  4 15 82
```

Only 34 candidates with "clean" data

```
# adding this flag variable to the main data set
CandidateDebtSub <- merge(CandidateDebtSub, aggr_comb[, c("filerid", "mult")], by = "filerid")
rm(aggr_comb)
```

```r
# counting number of unique offices among those 34 candidates
length(unique(CandidateDebtSub$office[CandidateDebtSub$mult == 0]))
```

```
## [1] 9
```

```r
# counting number of unique parties/offices among those 34 candidates
aggr_party <- aggregate(amount_num ~ filerid + party + office, data = CandidateDebtSub[CandidateDebtSub$
table(aggr_party$office, aggr_party$party)
```

```
##
##                                DEMOCRAT NON PARTISAN REPUBLICAN
##   ATTORNEY GENERAL                    0            0          1
##   COUNTY COMMISSIONER                 3            2          0
##   GOVERNOR                            0            0          1
##   PUBLIC UTILITY COMMISSIONER         0            0          2
##   SECRETARY OF STATE                  0            0          1
##   STATE REPRESENTATIVE                4            2          9
##   STATE SENATOR                       0            0          2
##   STATE SUPREME COURT JUSTICE         1            0          0
##   SUPERIOR COURT JUDGE                3            1          2
```

```r
rm(aggr_party)
```

Based on the above, only "State Prepresentative" and "Superior Court Judge" had representatives of two major parties.This is suspect. Hence, we will eclude the following 5 variables from the analysis: *legislativedistrict*, *party*, *jurisdiction*, *jurisdictioncounty*, *jurisdictiontype*

1.5 Creating extra variables

Processing date variables

```r
summary(CandidateDebtSub$debtdate)
```

```
##         Min.      1st Qu.       Median         Mean      3rd Qu.
## "2008-10-29" "2011-07-03" "2012-02-29" "2011-12-13" "2012-07-03"
##         Max.
## "2012-08-31"
```

```r
summary(CandidateDebtSub$fromdate)
```

```
##         Min.      1st Qu.       Median         Mean      3rd Qu.
## "2009-10-01" "2011-10-01" "2012-02-01" "2011-12-19" "2012-06-01"
##         Max.
## "2012-08-01"
```

```r
summary(CandidateDebtSub$thrudate)
```

```
##         Min.      1st Qu.       Median         Mean      3rd Qu.
## "2009-10-31" "2011-10-31" "2012-02-29" "2012-01-20" "2012-07-16"
##         Max.
## "2012-08-31"
```

Based on the above we will assume that the election was in August 2012

```r
# Number of months before election the debt occured
CandidateDebtSub$weeksindebt <-
  round(difftime(max(CandidateDebtSub$debtdate), CandidateDebtSub$debtdate, units = "weeks"))
CandidateDebtSub$monthsindebt <-
```

```
  round(CandidateDebtSub$weeksindebt / 52 * 12)
CandidateDebtSub$monthsindebt <-
  as.numeric(CandidateDebtSub$monthsindebt)
# capping months at 13 months (for exploratory reasons)
CandidateDebtSub$monthsindebt_cap <-
  ifelse(CandidateDebtSub$monthsindebt > 12, 13, CandidateDebtSub$monthsindebt)
summary(CandidateDebtSub$monthsindebt)
```

```
##    Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##   0.000   2.000   6.000   8.583  14.000  46.000
```

```
summary(CandidateDebtSub$monthsindebt_cap)
```

```
##    Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##    0.00    2.00    6.00    6.73   13.00   13.00
```

Recoding debt *description* variable to make it more digestable

```
creditcard <- c("AM EX", "AMERICAN EXPRESS", "AMERICAN EXPRESS LOWES", "AMEX",
                "CITI MASTERCARD", "MASTERCARD", "VISA", "CAPITOL ONE",
                "MASTER CARD")
consulting <- c("CONSULTING", "JANUARY SERVICES", "$750 PER MONTH THROUGH OCTOBER",
                "AUGUST CONSULTING", "CONSULTING ESTIMATE", "CONSULTING/PHOTOGRAPHY",
                "CONSULTING/TRAVEL", "MAY CONSULTING SERVICES", "MONTHLY CONSULTING FEE",
                "RETAINER", "APRIL RETAINER")
swag <- c("RE-ORDER TEE SHIRTS", "BUMPER STICKERS/FLYERS", "CONSULTING/YARD SIGNS",
          "YARD SIGNS", "OFFICE SUPPLIES/ WATER FOR KICKOFF")

CandidateDebtSub$description_aggr[grepl("TREASURY", CandidateDebtSub$description, ignore.case = TRUE)] <
  "TREASURY"
CandidateDebtSub$description_aggr[grepl("CAMPAIGN", CandidateDebtSub$description, ignore.case = TRUE)] <
  "CAMPAIGN MANAGEMENT"
CandidateDebtSub$description_aggr[grepl("FUND", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "FUNDRAISING"
CandidateDebtSub$description_aggr[grepl("CARRY FORWARD", CandidateDebtSub$description, ignore.case = TRU
  "CARRY FORWARD"
CandidateDebtSub$description_aggr[grepl("REIMB", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "REIMBURSEMENT"
CandidateDebtSub$description_aggr[grepl("ACCOUNTING", CandidateDebtSub$description, ignore.case = TRUE)
  "ACCOUNTING"
CandidateDebtSub$description_aggr[grepl("BONUS", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "BONUS"
CandidateDebtSub$description_aggr[grepl("DESIGN", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "DESIGN/PRINT"
CandidateDebtSub$description_aggr[grepl("PRINT", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "DESIGN/PRINT"
CandidateDebtSub$description_aggr[grepl("POLLING", CandidateDebtSub$description, ignore.case = TRUE)] <
  "POLLING"
CandidateDebtSub$description_aggr[grepl("CREDIT", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "CREDIT CARD"
CandidateDebtSub$description_aggr[CandidateDebtSub$vendorname %in% creditcard] <-
  "CREDIT CARD"
CandidateDebtSub$description_aggr[CandidateDebtSub$description %in% consulting] <-
  "CONSULTING"
CandidateDebtSub$description_aggr[CandidateDebtSub$description %in% swag] <-
```

```
  "SWAG"
CandidateDebtSub$description_aggr[grepl("MAIL", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "MAIL"
CandidateDebtSub$description_aggr[grepl("POSTAGE", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "MAIL"
CandidateDebtSub$description_aggr[grepl("STAMPS", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "MAIL"
CandidateDebtSub$description_aggr[grepl("DATA", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "DATA/TECH/AD"
CandidateDebtSub$description_aggr[grepl("DISPLAY", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "DATA/TECH/AD"
CandidateDebtSub$description_aggr[grepl("WEB", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "DATA/TECH/AD"
CandidateDebtSub$description_aggr[grepl("ADVERTISEMENT", CandidateDebtSub$description, ignore.case = TRU
  "DATA/TECH/AD"
CandidateDebtSub$description_aggr[grepl("COMPUTER", CandidateDebtSub$description, ignore.case = TRUE)] <-
  "DATA/TECH/AD"
CandidateDebtSub$description_aggr[is.na(CandidateDebtSub$description_aggr)] <- "OTHER"

rm(list = c("creditcard", "consulting", "swag"))
table(CandidateDebtSub$description_aggr)
```

```
##
##          ACCOUNTING               BONUS CAMPAIGN MANAGEMENT
##                  79                  22                  10
##       CARRY FORWARD          CONSULTING         CREDIT CARD
##                  17                 130                  42
##        DATA/TECH/AD        DESIGN/PRINT         FUNDRAISING
##                  30                  36                  45
##                MAIL               OTHER             POLLING
##                  14                  24                   5
##       REIMBURSEMENT                SWAG            TREASURY
##                  54                 261                 218
```

```
#table(CandidateDebtSub$description[CandidateDebtSub$description_aggr == "OTHER"])
```

```
aggr_descr <- aggregate(amount_num ~ description_aggr, data = CandidateDebtSub, sum)
aggr_descr[order(-aggr_descr$amount_num),]
```

```
##       description_aggr amount_num
## 5           CONSULTING  706613.68
## 4        CARRY FORWARD  132400.93
## 1           ACCOUNTING   94592.75
## 14               SWAG   85218.14
## 9          FUNDRAISING   64764.36
## 15            TREASURY   56146.29
## 10                MAIL   35683.97
## 2                BONUS   35500.00
## 8         DESIGN/PRINT   31081.60
## 6          CREDIT CARD   21186.69
## 12             POLLING   20000.00
## 11               OTHER   14924.79
## 7         DATA/TECH/AD   13540.00
## 3  CAMPAIGN MANAGEMENT   11517.20
## 13       REIMBURSEMENT    6737.84
```

```r
rm(aggr_descr)
```

Now we are ready to explore!

```r
save(CandidateDebtSub, file = "CandidateDebtSub.RData")
```