Data Extraction and Manipulation

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```
# Stardard libraries
library(jsonlite)
library(dplyr)
library(ggplot2)
library(tidyr)
library(RSocrata)
library(acs)
# Explicitly added the package of reshape2 for melt function
library(reshape2)
```

Open Government Data Use the following code to obtain data on the Seattle Police Department Police Report Incidents.

```
# Importing the JSON file from URL
policeIncidents <- fromJSON("https://data.seattle.gov/resource/7ais-f98f.json")
# Exploring the dataset
head(policeIncidents)</pre>
```

```
##
     offense_code
                               offense_type census_tract_2000
## 1
                            DISTURBANCE-OTH
                                                      100.3004
## 2
             1313
                               ASSLT-NONAGG
                                                    10702.3009
## 3
             2404
                             VEH-THEFT-AUTO
                                                    3100.5011
## 4
             5707
                                   TRESPASS
                                                     7200.1079
## 5
             1206 ROBBERY-STREET-BODYFORCE
                                                     8100.3011
## 6
                            DISTURBANCE-OTH
                                                     8400.1004
##
           date_reported location.needs_recoding location.longitude
## 1 2016-02-21T08:58:00
                                            FALSE
                                                       -122.290794373
## 2 2016-02-21T08:36:00
                                            FALSE
                                                       -122.370819092
## 3 2016-02-21T08:09:00
                                            FALSE
                                                       -122.398323059
## 4 2016-02-21T07:15:00
                                            FALSE
                                                       -122.349639893
## 5 2016-02-21T07:11:00
                                            FALSE
                                                       -122.342880249
## 6 2016-02-21T06:14:00
                                                       -122.325515747
                                            FALSE
##
     location.latitude occurred_date_range_end zone_beat
## 1
          47.720947266
                            2016-02-21T08:58:00
                                                        L3
## 2
          47.543205261
                                                        WЗ
                                           <NA>
## 3
          47.688655853
                            2016-02-21T08:00:00
                                                        J2
## 4
          47.618579865
                                                        QЗ
                                           <NA>
## 5
           47.60981369
                                           <NA>
                                                        M1
## 6
          47.614086151
                                           <NA>
                                                        E3
```

```
offense_code_extension district_sector
                                                 hundred_block_location
## 1
                                                 125XX BLOCK OF 35 AV NE
                          21
                                           Τ.
## 2
                           0
                                            W 65XX BLOCK OF SYLVAN WY SW
## 3
                                                  83XX BLOCK OF 32 AV NW
                           1
                                            J
## 4
                           0
                                            Q
                                                   3XX BLOCK OF DENNY WY
## 5
                           0
                                                19XX BLOCK OF WESTERN AV
                                            М
                                            Ε
                                                   SUMMIT AV / E PIKE ST
## 6
                          21
##
     summarized_offense_description month general_offense_number year
## 1
                         DISTURBANCE
                                         2
                                                         201662362 2016
## 2
                                          2
                             ASSAULT
                                                         201662321 2016
## 3
                       VEHICLE THEFT
                                          2
                                                         201662337 2016
                                          2
## 4
                                                         201662300 2016
                            TRESPASS
                                          2
## 5
                             ROBBERY
                                                         201662295 2016
                                          2
## 6
                         DISTURBANCE
                                                         201662265 2016
##
          longitude summary_offense_code
                                               latitude rms_cdw_id
## 1 -122.290794373
                                        X 47.720947266
                                                             644277
## 2 -122.370819092
                                     1300 47.543205261
                                                             644273
## 3 -122.398323059
                                     2400 47.688655853
                                                             644307
## 4 -122.349639893
                                     5700 47.618579865
                                                             644306
## 5 -122.342880249
                                     1200 47.609813690
                                                             644251
## 6 -122.325515747
                                        X 47.614086151
                                                             644210
     occurred_date_or_date_range_start
## 1
                    2016-02-21T08:00:00
## 2
                   2016-02-21T08:36:00
## 3
                   2016-02-20T20:40:00
## 4
                   2016-02-21T07:15:00
## 5
                    2016-02-21T07:00:00
                    2016-02-21T04:24:00
## 6
# Getting the dmensions of the dataset
dim(policeIncidents)
```

[1] 1000 19

Exploring the variables colnames(policeIncidents)

```
[1] "offense_code"
##
##
    [2] "offense_type"
##
   [3] "census_tract_2000"
##
   [4] "date_reported"
   [5] "location"
##
    [6] "occurred_date_range_end"
##
##
   [7] "zone_beat"
   [8] "offense_code_extension"
##
    [9] "district_sector"
## [10] "hundred_block_location"
  [11] "summarized_offense_description"
## [12] "month"
## [13] "general_offense_number"
## [14] "year"
## [15] "longitude"
## [16] "summary_offense_code"
```

```
## [17] "latitude"
## [18] "rms_cdw_id"
## [19] "occurred_date_or_date_range_start"
```

- (a) Describe, in detail, what the data represents. The data represents initial police reports taken down by police officers when responding to incidents around Seattle (Seattle Police Department Police Report Incident, 2010). The datset has 1000 observations and 19 variables. References -
- [1] Seattle Police Department Police Report Incident | Data.Seattle.Gov | Seattle's Data Site. (2010, July 28). Retrieved October 18, 2015, from https://data.seattle.gov/Public-Safety/Seattle-Police-Department-Police-Report-Incident/7ais-f98f
- (b) Describe each variable and what it measures. Be sure to note when data is missing. Confirm that each variable is appropriately cast it has the correct data type. If any are incorrect, recast them to be in the appropriate format. The data set has the following variables -
- [1] "offense code" "offense type" "census tract 2000" "date reported"
- [5] "location" "zone_beat" "offense_code_extension" "district_sector"
- [9] "hundred_block_location" "summarized_offense_description" "month" "general_offense_number"
- [13] "year" "longitude" "summary offense code" "latitude"
- [17] "rms_cdw_id" "occurred_date_or_date_range_start" "occurred_date_range_end"

Description for the variables - The data set has the following variables -

- [1] "offense_code" The offense code for the police incident.
- [2] "offense_type" The type of offense such as identity theft, disturbance, burgulary etc.
- [3] "census_tract_2000" This is the census tract 2000 data.
- [4] "date_reported" The date the incident was reported on.
- [5] "location" The data frame having the information such as needs recoding, longitude and latitude.
- [6] "zone beat" The different zones that Seattle city is categorized into.
- [7] "offense_code_extension" Different code extensions to the offense.
- [8] "district_sector" The district sector of the incident.
- [9] "hundred_block_location" The hundred block region of the incident.
- [10] "summarized_offense_description" The summarized description of the offense. For example the offense type of "ASSLT-NONAGG" & "ASSLT-AGG-WEAPON" are categorized as "ASSAULT" in this variable. This variable gives a more broader category for the offense.
- [11] "month" The month that the incident occured.
- [12] "general_offense_number" The general offense number given to an incident.
- [13] "year" The year that the incident occured.
- [14] "longitude" The longitude measurement of the location of the incident.
- [15] "summary_offense_code" The summarized offense code of the incident.
- [16] "latitude" The latitude measurement of the location of the incident.
- [17] "rms cdw id" Unique row identifier (Seattle Police Department Police Report Incident, 2010).
- [18] "occurred_date_or_date_range_start" The date the incident occured or started. [19] "occurred_date_range_end" The date the incident ended or the report was closed.

The rms_cdw_id is the unique code identifying each record. The following variables identify different types details about the offense, such as different offense codes and its description -

[1] "offense_code" "offense_type" "offense_code_extension" "summarized_offense_description" [5] "general offense number" "summary offense code"

The dataset also has variables describing the date and time of the offenses [1] "date_reported" "occurred date or date range start" "occurred date range end"

All the variables are in character data type. Though character datatype makes sense for most variables, but some variables need to be recast as numeric due to the nature of value recorded.

Recasting of the variables are as follows -

```
All the variables except the ones below have the appropriate datatype. The following variables need to be recasted in the format: Variable - Existing datatype - To recasted datatype policeIncidents$location$longitude - character - numeric policeIncidents$location$latitude - character - numeric policeIncidents$longitude - character - numeric policeIncidents$latitude - character - numeric policeIncidents$month - character - numeric policeIncidents$year - character - numeric
```

Missing Data -

- 1. offense_code This variable has values of 'X', which are probably refer to missing data.
- 2. summary_offense_code This variable has values of 'X', which are probably refer to missing data.
- 3. occured_date_range_end This variable has NA values signifying missing data. References -

[1] Seattle Police Department Police Report Incident | Data.Seattle.Gov | Seattle's Data Site. (2010, July 28). Retrieved October 18, 2015, from https://data.seattle.gov/Public-Safety/Seattle-Police-Department-Police-Report-Incident/7ais-f98f

```
# Exploring the variables
colnames(policeIncidents)
```

```
##
    [1] "offense_code"
##
    [2] "offense_type"
##
    [3] "census_tract_2000"
    [4] "date_reported"
##
    [5] "location"
##
    [6] "occurred_date_range_end"
##
##
   [7] "zone beat"
   [8] "offense code extension"
##
       "district sector"
##
   [9]
## [10] "hundred_block_location"
## [11] "summarized_offense_description"
## [12] "month"
## [13] "general_offense_number"
## [14] "year"
## [15] "longitude"
## [16] "summary_offense_code"
  [17] "latitude"
  [18] "rms_cdw_id"
## [19] "occurred_date_or_date_range_start"
```

```
# Summary of each variable
summary(policeIncidents)
```

```
## offense_code offense_type census_tract_2000
## Length:1000 Length:1000 Length:1000
## Class :character Class :character Class :character
## Mode :character Mode :character
## date_reported
```

```
## Length:1000
## Class :character
## Mode :character
## location.needs_recoding location.longitude location.latitude
## Mode :logical
                       Length: 1000
                                           Length: 1000
## FALSE:1000
                       Class : character
                                           Class : character
## NA's :0
                                           Mode :character
                       Mode :character
## occurred_date_range_end zone_beat
                                              offense code extension
## Length:1000
                           Length: 1000
                                              Length: 1000
## Class :character
                                              Class :character
                           Class : character
## Mode :character
                           Mode :character
                                              Mode :character
## district_sector
                      hundred_block_location summarized_offense_description
## Length:1000
                      Length: 1000
                                              Length: 1000
## Class :character
                      Class :character
                                              Class : character
## Mode :character
                      Mode :character
                                              Mode :character
##
       month
                       general_offense_number
                                                 year
## Length:1000
                      Length:1000
                                             Length: 1000
## Class:character Class:character
                                              Class : character
                                             Mode :character
## Mode :character Mode :character
##
   longitude
                      summary offense code
                                             latitude
## Length:1000
                      Length: 1000
                                           Length: 1000
## Class :character
                      Class : character
                                           Class : character
## Mode :character Mode :character
                                           Mode :character
   rms cdw id
                      occurred_date_or_date_range_start
##
## Length:1000
                      Length: 1000
## Class :character
                      Class : character
## Mode :character
                      Mode :character
# Exploring different types of variable category
names(select(policeIncidents,contains("offense")))
## [1] "offense_code"
                                        "offense_type"
## [3] "offense_code_extension"
                                        "summarized_offense_description"
## [5] "general_offense_number"
                                        "summary_offense_code"
names(select(policeIncidents,contains("date")))
## [1] "date_reported"
                                           "occurred_date_range_end"
## [3] "occurred_date_or_date_range_start"
# Exploring the class and mode of the variables
sapply(policeIncidents,class)
##
                        offense_code
                                                          offense_type
##
                         "character"
                                                           "character"
##
                   census_tract_2000
                                                         date_reported
##
                         "character"
                                                           "character"
##
                           location
                                               occurred_date_range_end
##
                        "data.frame"
                                                           "character"
##
                          zone_beat
                                                offense_code_extension
##
                         "character"
                                                           "character"
##
                     district_sector
                                               hundred_block_location
```

```
##
                          "character"
                                                              "character"
##
      summarized_offense_description
                                                                    month
                          "character"
##
                                                              "character"
##
              general_offense_number
                                                                     year
##
                          "character"
                                                              "character"
##
                            longitude
                                                    summary offense code
##
                          "character"
                                                              "character"
##
                             latitude
                                                               rms cdw id
##
                          "character"
                                                              "character"
##
   occurred_date_or_date_range_start
                          "character"
sapply(policeIncidents,mode)
##
                         offense_code
                                                             offense_type
##
                          "character"
                                                              "character"
                    census_tract_2000
##
                                                            date_reported
                          "character"
##
                                                              "character"
##
                             location
                                                 occurred_date_range_end
                               "list"
##
                                                              "character"
##
                            zone_beat
                                                  offense_code_extension
##
                          "character"
                                                              "character"
##
                      district sector
                                                  hundred block location
##
                          "character"
                                                              "character"
##
      summarized_offense_description
                                                                    month
                          "character"
##
                                                              "character"
##
               general_offense_number
                                                                     year
                                                              "character"
##
                          "character"
##
                            longitude
                                                     summary_offense_code
##
                          "character"
                                                              "character"
##
                             latitude
                                                               rms_cdw_id
##
                          "character"
                                                              "character"
   occurred_date_or_date_range_start
##
                          "character"
# Exploring the location data frame
names(policeIncidents$location)
## [1] "needs_recoding" "longitude"
                                           "latitude"
# Recasting some of the variables from character to numeric data type
policeIncidents$location$longitude<-as.numeric(policeIncidents$location$longitude)
policeIncidents$location$latitude<-as.numeric(policeIncidents$location$latitude)
policeIncidents$longitude<-as.numeric(policeIncidents$longitude)</pre>
policeIncidents$latitude<-as.numeric(policeIncidents$latitude)</pre>
policeIncidents$month<-as.numeric(policeIncidents$month)</pre>
policeIncidents$year<-as.numeric(policeIncidents$year)</pre>
# Recasting date variables to Date datatype
policeIncidents$date_reported<-as.Date(policeIncidents$date_reported)
# Recasting date variables to Date datatype after formatting them using sub function
policeIncidents$occurred_date_or_date_range_start<-as.Date(sub("T"," ",policeIncidents$occurred_date_or
policeIncidents$occurred_date_range_end<-as.Date(sub("T"," ",policeIncidents$occurred_date_range_end))
```

#View(policeIncidents)

```
# Copying the recasted policeIncidents dataset to tidy it
policeIncidents.tidy<-policeIncidents
#Checking the needs_recording column inside location data frame
summary(policeIncidents.tidy[,"location"]["needs_recoding"])</pre>
```

(c) Produce a clean dataset, according to the rules of tidy data discussed in class. Export the data for future analysis using the Rdata format.

```
## needs_recoding
## Mode :logical
## FALSE:1000
## NA's :0

#Extracting latitude and longitude from the data frame location embedded in policeIncidents
policeIncidents.tidy$location_longitude<-policeIncidents.tidy[,"location"]["longitude"]
policeIncidents.tidy$location_latitude<-policeIncidents.tidy[,"location"]["latitude"]
# Removing location dataframe
policeIncidents.tidy<-subset(policeIncidents.tidy,select=-location)
summary(policeIncidents.tidy)</pre>
```

```
offense_code
                      offense_type
                                         census_tract_2000
   Length: 1000
                      Length: 1000
                                         Length: 1000
##
   Class :character
                      Class : character
                                         Class : character
                                         Mode :character
##
  Mode :character
                      Mode :character
##
##
##
  date_reported
                        occurred_date_range_end zone_beat
##
## Min.
          :2016-02-13 Min.
                               :2015-11-11
                                               Length: 1000
  1st Qu.:2016-02-14
                       1st Qu.:2016-02-13
##
                                               Class : character
## Median :2016-02-16 Median :2016-02-15
                                               Mode :character
## Mean
         :2016-02-16 Mean :2016-02-14
## 3rd Qu.:2016-02-18
                        3rd Qu.:2016-02-17
## Max.
         :2016-02-21
                        Max.
                               :2016-02-21
## offense_code_extension district_sector
                                             hundred_block_location
## Length:1000
                          Length:1000
                                             Length: 1000
## Class :character
                          Class : character
                                             Class : character
##
   Mode :character
                          Mode :character
                                             Mode :character
##
##
##
##
   summarized offense description
                                                  general_offense_number
                                      month
## Length:1000
                                  Min. : 1.000
                                                  Length: 1000
## Class :character
                                  1st Qu.: 2.000
                                                  Class : character
## Mode :character
                                                  Mode :character
                                  Median : 2.000
```

```
##
                                  Mean : 2.041
##
                                  3rd Qu.: 2.000
                                  Max.
##
                                        :12.000
##
                    longitude
                                  summary_offense_code
                                                          latitude
        year
## Min.
          :2014
                  Min.
                         :-122.4
                                  Length: 1000
                                                       Min.
                                                              :47.50
   1st Qu.:2016
                 1st Qu.:-122.3
                                  Class :character
                                                       1st Qu.:47.60
## Median :2016
                 Median :-122.3
                                  Mode :character
                                                       Median :47.62
                  Mean :-122.3
## Mean :2016
                                                       Mean
                                                             :47.63
## 3rd Qu.:2016
                  3rd Qu.:-122.3
                                                       3rd Qu.:47.67
## Max. :2016
                                                       Max. :47.73
                  Max. :-122.3
                      occurred_date_or_date_range_start
   rms_cdw_id
                             :2014-01-01
## Length:1000
                      Min.
## Class :character
                      1st Qu.:2016-02-13
## Mode :character
                      Median :2016-02-15
##
                      Mean
                             :2016-02-12
##
                      3rd Qu.:2016-02-17
##
                      Max.
                             :2016-02-21
## location_longitude.longitude location_latitude.latitude
## Min.
         :-122.41139
                               Min.
                                     :47.49896
## 1st Qu.:-122.34565
                                1st Qu.:47.60088
## Median :-122.33043
                               Median: 47.61645
## Mean :-122.33073
                                Mean
                                     :47.62676
## 3rd Qu.:-122.31547
                                3rd Qu.:47.66865
## Max. :-122.25001
                                Max.
                                       :47.73394
# Checking if multiple columns of longitude have the same data
diff<-policeIncidents.tidy$longitude-policeIncidents.tidy$location_longitude
summary(diff)
##
     longitude
## Min.
          :0
## 1st Qu.:0
## Median:0
## Mean :0
## 3rd Qu.:0
## Max. :0
# Checking if multiple columns of latitude have the same data
diff<-policeIncidents.tidy$latitude-policeIncidents.tidy$location_latitude
summary(diff)
      latitude
##
## Min.
         :0
## 1st Qu.:0
## Median:0
## Mean :0
## 3rd Qu.:0
## Max. :0
#Removing the extra columns
policeIncidents.tidy<-subset(policeIncidents.tidy,select=-c(location_longitude,location_latitude))
# Dataset details after tidying
summary(policeIncidents.tidy)
```

```
offense code
                       offense_type
                                           census_tract_2000
                                           Length: 1000
##
    Length: 1000
                       Length: 1000
                                           Class : character
    Class : character
                       Class :character
                       Mode :character
##
   Mode : character
                                           Mode :character
##
##
##
##
    date_reported
                         occurred_date_range_end
                                                   zone beat
##
    Min.
           :2016-02-13
                         Min.
                                 :2015-11-11
                                                  Length: 1000
##
   1st Qu.:2016-02-14
                         1st Qu.:2016-02-13
                                                   Class : character
   Median :2016-02-16
                         Median :2016-02-15
                                                  Mode : character
## Mean
           :2016-02-16
                         Mean
                                 :2016-02-14
##
    3rd Qu.:2016-02-18
                         3rd Qu.:2016-02-17
## Max.
           :2016-02-21
                         Max.
                                 :2016-02-21
##
  offense_code_extension district_sector
                                               hundred_block_location
##
    Length: 1000
                            Length: 1000
                                               Length: 1000
##
    Class :character
                            Class :character
                                               Class : character
##
    Mode :character
                            Mode :character
                                               Mode :character
##
##
##
##
    summarized_offense_description
                                                     general_offense_number
                                        month
    Length: 1000
                                           : 1.000
                                                     Length: 1000
##
                                    Min.
    Class : character
                                    1st Qu.: 2.000
                                                     Class : character
##
##
    Mode :character
                                                     Mode :character
                                    Median : 2.000
##
                                    Mean
                                          : 2.041
##
                                    3rd Qu.: 2.000
##
                                           :12.000
                                    Max.
##
                     longitude
                                     summary_offense_code
                                                              latitude
         year
           :2014
                   Min.
                           :-122.4
                                     Length: 1000
                                                           Min.
                                                                  :47.50
    Min.
                                     Class :character
##
    1st Qu.:2016
                   1st Qu.:-122.3
                                                           1st Qu.:47.60
##
    Median:2016
                   Median :-122.3
                                     Mode :character
                                                           Median :47.62
##
   Mean
           :2016
                   Mean
                          :-122.3
                                                           Mean
                                                                  :47.63
    3rd Qu.:2016
                   3rd Qu.:-122.3
                                                           3rd Qu.:47.67
##
##
    Max.
           :2016
                   Max.
                           :-122.3
                                                           Max.
                                                                  :47.73
##
    rms_cdw_id
                       occurred_date_or_date_range_start
##
  Length: 1000
                       Min.
                               :2014-01-01
##
   Class : character
                       1st Qu.:2016-02-13
##
    Mode :character
                       Median :2016-02-15
##
                       Mean
                               :2016-02-12
##
                       3rd Qu.:2016-02-17
##
                       Max.
                               :2016-02-21
colnames(policeIncidents.tidy)
```

```
##
   [1] "offense_code"
##
    [2] "offense_type"
   [3] "census_tract_2000"
##
##
   [4] "date reported"
   [5] "occurred_date_range_end"
##
##
    [6] "zone beat"
   [7] "offense_code_extension"
##
   [8] "district sector"
  [9] "hundred_block_location"
##
```

```
## [10] "summarized_offense_description"
## [11] "month"
## [12] "general_offense_number"
## [13] "year"
## [14] "longitude"
## [15] "summary_offense_code"
## [16] "latitude"
## [17] "rms cdw id"
## [18] "occurred_date_or_date_range_start"
# Melting the date variables and removing NA values
policeIncidents.tidy<-melt(</pre>
  data=policeIncidents.tidy,
  id=c("offense_code", "offense_type", "census_tract_2000", "zone_beat", "offense_code_extension", "district
  variable.name = "date_type",
  value.name = "date_value",
  na.rm=TRUE
# Melting the location variables and removing NA values
policeIncidents.tidy<-melt(</pre>
  data=policeIncidents.tidy,
  id=c("offense_code", "offense_type", "census_tract_2000", "zone_beat", "offense_code_extension", "district
  variable.name = "location measure",
  value.name = "location_value",
  na.rm=TRUE
)
# Exploring variables of the offense category
head(select(policeIncidents.tidy,contains("offense")))
##
     offense_code
                               offense_type offense_code_extension
## 1
                Х
                            DISTURBANCE-OTH
                                                                  21
## 2
                               ASSLT-NONAGG
                                                                   0
             1313
## 3
             2404
                             VEH-THEFT-AUTO
                                                                   1
             5707
                                                                   0
## 4
                                   TRESPASS
             1206 ROBBERY-STREET-BODYFORCE
## 5
                                                                   0
## 6
                            DISTURBANCE-OTH
                                                                  21
     summarized_offense_description general_offense_number
## 1
                         DISTURBANCE
                                                   201662362
## 2
                             ASSAULT
                                                   201662321
## 3
                       VEHICLE THEFT
                                                   201662337
## 4
                            TRESPASS
                                                   201662300
## 5
                             ROBBERY
                                                   201662295
## 6
                         DISTURBANCE
                                                   201662265
     summary_offense_code
## 1
                         Х
## 2
                      1300
## 3
                      2400
## 4
                      5700
## 5
                      1200
## 6
                         Х
```

```
# Melting the different types of offense codes and removing NA values
policeIncidents.tidy<-melt(</pre>
  data=policeIncidents.tidy,
  id=c("offense_type", "census_tract_2000", "zone_beat", "district_sector", "hundred_block_location", "summa
  variable.name = "offense_code_type",
  value.name = "offense_code_value",
  na.rm=TRUE
# Viewing the tidied dataset
#View(policeIncidents.tidy)
# Exploring the tidied dataset
head(policeIncidents.tidy)
##
                 offense_type census_tract_2000 zone_beat district_sector
## 1
              DISTURBANCE-OTH
                                        100.3004
                                                         L3
                                                                           L
## 2
                 ASSLT-NONAGG
                                      10702.3009
                                                         WЗ
                                                                           W
## 3
               VEH-THEFT-AUTO
                                       3100.5011
                                                         J2
                                                                           J
## 4
                                                         QЗ
                                                                           Q
                     TRESPASS
                                       7200.1079
## 5 ROBBERY-STREET-BODYFORCE
                                       8100.3011
                                                         M1
                                                                          М
              DISTURBANCE-OTH
                                       8400.1004
                                                         E3
##
         hundred_block_location summarized_offense_description month year
        125XX BLOCK OF 35 AV NE
                                                    DISTURBANCE
## 2 65XX BLOCK OF SYLVAN WY SW
                                                                     2 2016
                                                         ASSAULT
## 3
         83XX BLOCK OF 32 AV NW
                                                   VEHICLE THEFT
                                                                     2 2016
## 4
          3XX BLOCK OF DENNY WY
                                                        TRESPASS
                                                                     2 2016
## 5
       19XX BLOCK OF WESTERN AV
                                                         ROBBERY
                                                                     2 2016
## 6
          SUMMIT AV / E PIKE ST
                                                     DISTURBANCE
                                                                     2 2016
##
                    date_type date_value location_measure location_value
     rms_cdw_id
## 1
         644277 date_reported 2016-02-21
                                                  longitude
                                                                 -122.2908
## 2
         644273 date_reported 2016-02-21
                                                                 -122.3708
                                                  longitude
## 3
         644307 date_reported 2016-02-21
                                                  longitude
                                                                 -122.3983
## 4
         644306 date_reported 2016-02-21
                                                  longitude
                                                                 -122.3496
## 5
         644251 date_reported 2016-02-21
                                                  longitude
                                                                 -122.3429
## 6
         644210 date_reported 2016-02-21
                                                                 -122.3255
                                                  longitude
     offense_code_type offense_code_value
##
## 1
          offense code
## 2
          offense code
                                      1313
## 3
          offense_code
                                      2404
## 4
          offense_code
                                      5707
## 5
          offense_code
                                      1206
## 6
          offense_code
                                         Х
colnames(policeIncidents.tidy)
    [1] "offense_type"
                                           "census_tract_2000"
                                          "district_sector"
##
   [3] "zone_beat"
  [5] "hundred_block_location"
                                          "summarized_offense_description"
  [7] "month"
                                          "year"
##
##
   [9] "rms cdw id"
                                          "date_type"
## [11] "date_value"
                                          "location_measure"
## [13] "location value"
                                          "offense_code_type"
## [15] "offense_code_value"
```

summary(policeIncidents.tidy)

```
offense_type
                        census_tract_2000
                                             zone_beat
    Length: 19296
                        Length: 19296
                                            Length: 19296
##
    Class : character
                        Class : character
                                            Class : character
   Mode :character
                                            Mode :character
                        Mode :character
##
##
##
##
##
                        \verb|hundred_block_location| summarized_offense_description|
    district_sector
   Length: 19296
                        Length: 19296
                                                Length: 19296
##
    Class : character
                        Class : character
                                                Class : character
##
    Mode :character
                        Mode : character
                                                Mode : character
##
##
##
##
        month
                           year
                                      rms_cdw_id
##
    Min.
          : 1.000
                      Min.
                             :2014
                                     Length: 19296
##
    1st Qu.: 2.000
                      1st Qu.:2016
                                     Class :character
##
   Median : 2.000
                      Median:2016
                                     Mode :character
    Mean
          : 2.047
                             :2016
##
                      Mean
##
    3rd Qu.: 2.000
                      3rd Qu.:2016
                      Max.
                             :2016
##
    Max.
         :12.000
##
                                 date_type
                                                 date_value
##
    date_reported
                                       :8000
                                                      :2014-01-01
                                               Min.
    occurred_date_range_end
                                       :3296
                                               1st Qu.:2016-02-14
##
##
    occurred_date_or_date_range_start:8000
                                               Median :2016-02-16
##
                                                      :2016-02-14
                                               Mean
##
                                               3rd Qu.:2016-02-17
##
                                               Max.
                                                       :2016-02-21
##
     location_measure location_value
                                                       offense_code_type
##
    longitude:9648
                      Min.
                              :-122.41
                                                                 :4824
                                          offense_code
    latitude:9648
##
                       1st Qu.:-122.33
                                          offense code extension:4824
##
                       Median : -37.38
                                          general offense number: 4824
##
                       Mean
                             : -37.35
                                          summary_offense_code :4824
##
                       3rd Qu.: 47.62
##
                       Max.
                              : 47.73
##
    offense_code_value
##
    Length: 19296
##
    Class : character
##
    Mode :character
##
##
##
```

apply(policeIncidents.tidy,2,class)

```
## offense_type census_tract_2000
## "character" "character"
## zone_beat district_sector
## "character" "character"
## hundred_block_location summarized_offense_description
```

```
##
                        "character"
                                                          "character"
##
                              month
                                                                  year
##
                        "character"
                                                          "character"
##
                         rms_cdw_id
                                                            date_type
##
                        "character"
                                                          "character"
                         date value
##
                                                    location measure
                        "character"
##
                                                          "character"
                     location value
##
                                                   offense_code_type
##
                        "character"
                                                          "character"
##
                offense_code_value
##
                        "character"
```

```
# Exporting the cleaned dataset
save(policeIncidents.tidy,file="policeIncidentsTidy.Rdata")
```

(d) Describe any concerns you might have about this data. This may include biases, missing data, or ethical concerns. The greatest ethical concern is the privacy of the victims who are involved in the police incident. The open dataset makes the infromation available to anyone without any verification or procedures. The longitude and latitude variables reveal the exact location of the incident. Also the police incident report can be combined with other sources of data and it can be used to cause greater discomfort for the victims. For example, a newspaper report about the items stolen in a house from a particular neighbourhood combined with the police incident report can give valuable information to the the wrong people. Hence, making the victims more vulnerable to future police incidents. The missing data in offense_code, summary_offense_code and occured_date_range_end variables represent incomplete information. The greater cause of concern is that we don't know how the missing values are represented in the different variables. For example what if '0' in offense_code_extension represents missing data. It is not easy to figure out all the meta data regarding the dataset and hence it is possible that people doing data analysis on the dataset can come to worng conclusions because of insufficient background on the dataset.

Exploring the NYC Flights Data In this problem set we will use the data on all flights that departed NYC (i.e. JFK, LGA or EWR) in 2013. You can find this data in the nycflights13 R package.

(a) Importing Data: Load the data and describe in a short paragraph how the data was collected and what each variable represents.

The nycflights data was collected from the Bureau of transportation statistics about the flights that departed from NYC airports in 2013. The dataset flights has 336776 observation of flights departing from NYC airports and 16 variables that capture the flight departure data. The dataset has the following variables -

- [1] "year" Year of departure which is 2013 for all the records
- [2] "month" Month of flight departure
- [3] "day" Day of departure
- [4] "dep_time" departure time of flight
- [5] "dep_delay" departure delay
- [6] "arr_time" arrival time
- [7] "arr_delay" arrival delay
- [8] "carrier" airline carrier (abbreviated in 2 letters)
- [8] "tailnum" Tail number of the plane
- [9] "flight" Flight number
- [10] "origin" Origin of the flight which is one of the NYC airports
- [11] "dest" Destination airport for the flight
- [13] "air time" Amount of time spent in air bny the flight
- [14] "distance" The distance flown by the flight

```
[15] "hour" - departure time in hours
[16] "minute" - departure time in minutes
# Importing the nycflights13 dataset
library(nycflights13)
flights<-nycflights13::flights
# Information about the dataset
#?nycflights13::flights
# Exploring the dataset
head(flights)
## Source: local data frame [6 x 16]
##
##
      year month
                   day dep_time dep_delay arr_time arr_delay carrier tailnum
##
     (int) (int) (int)
                           (int)
                                     (dbl)
                                               (int)
                                                         (dbl)
## 1
     2013
                                         2
                                                                    UA N14228
               1
                     1
                             517
                                                830
                                                            11
## 2
      2013
               1
                      1
                             533
                                         4
                                                850
                                                            20
                                                                    UA
                                                                        N24211
## 3
     2013
                             542
                                         2
                                                923
                                                            33
               1
                     1
                                                                    AA
                                                                        N619AA
## 4 2013
                      1
                             544
                                        -1
                                                1004
                                                           -18
                                                                    B6
                                                                        N804JB
## 5 2013
                             554
                                        -6
                                                812
                                                           -25
                                                                    DL
                                                                        N668DN
               1
                     1
## 6 2013
               1
                      1
                             554
                                        -4
                                                 740
                                                            12
                                                                    UA
                                                                        N39463
## Variables not shown: flight (int), origin (chr), dest (chr), air_time
     (dbl), distance (dbl), hour (dbl), minute (dbl)
dim(flights)
## [1] 336776
                  16
colnames(flights)
    [1] "year"
                     "month"
                                 "day"
                                              "dep_time"
                                                          "dep_delay"
    [6] "arr_time"
                     "arr_delay" "carrier"
                                              "tailnum"
                                                          "flight"
## [11] "origin"
                     "dest"
                                 "air_time"
                                             "distance"
                                                          "hour"
## [16] "minute"
summary(flights)
##
                       month
         year
                                          day
                                                         dep_time
##
    Min.
           :2013
                   Min. : 1.000
                                     Min. : 1.00
                                                            : 1
                                                      1st Qu.: 907
##
    1st Qu.:2013
                   1st Qu.: 4.000
                                     1st Qu.: 8.00
##
    Median :2013
                   Median : 7.000
                                     Median :16.00
                                                      Median:1401
           :2013
                                           :15.71
##
   Mean
                   Mean
                           : 6.549
                                     Mean
                                                      Mean
                                                             :1349
##
    3rd Qu.:2013
                   3rd Qu.:10.000
                                     3rd Qu.:23.00
                                                      3rd Qu.:1744
           :2013
                                                             :2400
##
    Max.
                           :12.000
                                            :31.00
                   Max.
                                     Max.
                                                      Max.
##
                                                      NA's
                                                             :8255
##
      dep_delay
                          arr_time
                                        arr_delay
                                                            carrier
##
           : -43.00
                      Min. : 1
                                             : -86.000
                                                          Length: 336776
    Min.
                                      Min.
##
    1st Qu.: -5.00
                      1st Qu.:1104
                                      1st Qu.: -17.000
                                                          Class : character
   Median : -2.00
                      Median:1535
                                      Median : -5.000
                                                          Mode :character
```

Mean

: 6.895

:1502

Mean

##

Mean

: 12.64

```
3rd Qu.: 11.00
                       3rd Qu.:1940
                                       3rd Qu.: 14.000
##
##
    Max.
           :1301.00
                               :2400
                                               :1272.000
                       Max.
                                       Max.
           :8255
                               :8713
##
    NA's
                       NA's
                                       NA's
                                               :9430
##
                            flight
                                           origin
      tailnum
                                                                 dest
##
    Length: 336776
                        Min.
                                :
                                    1
                                        Length: 336776
                                                            Length: 336776
    Class : character
                                        Class :character
##
                        1st Qu.: 553
                                                            Class : character
    Mode :character
                        Median:1496
                                        Mode :character
                                                            Mode :character
##
##
                        Mean
                                :1972
##
                        3rd Qu.:3465
##
                                :8500
                        Max.
##
##
       air_time
                        distance
                                          hour
                                                          minute
##
    Min.
          : 20.0
                            : 17
                                     Min.
                                            : 0.00
                                                      Min.
                                                             : 0.00
                     Min.
                                                      1st Qu.:16.00
##
    1st Qu.: 82.0
                     1st Qu.: 502
                                     1st Qu.: 9.00
##
    Median :129.0
                     Median: 872
                                     Median :14.00
                                                      Median :31.00
##
    Mean
           :150.7
                     Mean
                             :1040
                                     Mean
                                            :13.17
                                                      Mean
                                                              :31.76
##
    3rd Qu.:192.0
                                                      3rd Qu.:49.00
                     3rd Qu.:1389
                                     3rd Qu.:17.00
##
   Max.
           :695.0
                            :4983
                                             :24.00
                                                      Max.
                                                              :59.00
                     Max.
                                     Max.
    NA's
           :9430
                                     NA's
                                             :8255
                                                      NA's
                                                              :8255
##
```

sapply(flights,class)

```
##
                                             dep_time
                                                                        arr_time
          year
                      month
                                      day
                                                         dep_delay
##
     "integer"
                  "integer"
                               "integer"
                                            "integer"
                                                          "numeric"
                                                                       "integer"
     arr_delay
##
                    carrier
                                 tailnum
                                                flight
                                                             origin
                                                                            dest
##
     "numeric" "character" "character"
                                             "integer" "character" "character"
##
      air_time
                   distance
                                                minute
                                     hour
##
     "numeric"
                  "numeric"
                               "numeric"
                                            "numeric"
```

- **(b) Data Manipulation:** Use the flights data to answer each of the following questions. Be sure to answer each question with a written response and supporting analysis.
 - How many flights were there from NYC airports to Seattle in 2013?

There are 3923 flights from NYC airports to Seattle in 2013.

```
# Number of flights from NYC airports to Seattle airports

flights %>%
  filter(dest=="SEA") %>%
    summarise(flight_count_NYC_to_SEA = n())

## Source: local data frame [1 x 1]

##

## flight_count_NYC_to_SEA

## (int)

## 1 3923
```

• How many airlines fly from NYC to Seattle?

There are 5 airlines from NYC to Seattle.

```
# Number of distinct airlines that fly from NYC to Seattle
flights %>%
  filter(dest=="SEA") %>%
    distinct(carrier) %>%
    summarise(airlines_count_NYC_to_SEA = n())
```

```
## Source: local data frame [1 x 1]
##
## airlines_count_NYC_to_SEA
## (int)
## 1
```

• How many unique air planes fly from NYC to Seattle?

936 unique airplanes fly from NYC to Seattle

```
# Number of unique air planes(given by tailnum column) that fly from NYC to Seattle
flights %>%
  filter(dest=="SEA") %>%
    distinct(tailnum) %>%
    summarise(planes_count_NYC_to_SEA = n())
```

```
## Source: local data frame [1 x 1]
##
## planes_count_NYC_to_SEA
## (int)
## 1 936
```

1 -1.099099

• What is the average arrival delay for flights from NYC to Seattle?

The average arrival delay for flights from NYC to Seattle is -1.099099

```
# Average arrival delay for flights from NYC to Seattle
flights %>%
   filter(dest=="SEA") %>%
        summarise(avg_delay = mean(arr_delay, na.rm=TRUE))

## Source: local data frame [1 x 1]
##
## avg_delay
## (dbl)
```

• What proportion of flights to Seattle come from each NYC airport?

About 46.7% of flights to Seattle come from EWR airport in New York and 53.3% of flights to Seattle come from JFK airport.

```
# Proportion of flights to Seattle from respective NYC airports
flights %>%
  filter(dest=="SEA") %>%
    group_by(origin) %>%
      summarise(num_flights = n()) %>%
       mutate(proportion_flights = num_flights*100/sum(num_flights))
## Source: local data frame [2 x 3]
##
##
    origin num_flights proportion_flights
##
     (chr)
                 (int)
                                     (dbl)
## 1
       EWR
                  1831
                                 46.67346
                                 53.32654
## 2
       JFK
                  2092
```