UK Road Safety Data

Important Information

The UKRoadSafetyData.zip was provided to me to use as test data for analysis practice and demonstration. Link to dataset -

Tools

- Microsoft SQL Server Management Studio
- Microsoft Visual Studio 2022
- Microsoft Excel (Power Query, CSVs)
- Posit RStudio
- Tableau Public

Languages

- SQL
- R

Dataset First Impressions

- Upon receiving and extracting the 'UKRoadSafetyData.zip' file, I notice there are additional zip files.
- Within each zip file is a single .csv or .xls file.
- Several of these files are missing naming conventions that match other similar files.
 - Renamed files for consistency if needed later.
- The 2015 data is in a single zip, and these are also not following later file naming conventions, and yet more 2015 files exist with apparently duplicate data.
 - Both 2015 Accidents files begin with '201501BS70001' in cell A2 and contain 140057 rows.
 - But without looking further, there is not guarantee these have exactly duplicate data. This will require review.
 - Checked through Power Query, matching both sets of data on for each duplicate (Accidents, Casualties, and Vehicles for 2015).
 - Both sets are a perfect Match. Only need to import one set.
- The Variable Lookup is a set of codes tables. One question is whether I will want to keep these as separate tables, or perform a single codes_table combination.
 - The codes tables can remain separate, but it would require more write scripts.
 - If I combine them into a single table, they could be more manageable on the import.
 - However, I may not need to import these into my database. They may only be needed while visualizing the findings, in which case I can wait until I import them to Tableau. TBD.

Extract, Transform, Load (ETL)

Visual Studio 2022 + SQL

• Created three tables uk accidents uk vehicles uk casualties

uk accidents

```
/*
I had a lot of trouble with the Date column
but finally manged to run through steps in Power Query and SQL
that worked.
--DROP TABLE uk_accidents
-- Date VARCHAR (15),
--Date DATE,
CREATE TABLE uk_accidents (
   Accident Index VARCHAR(60),
   Location_Easting_OSGR INT,
   Location_Northing_OSGR INT,
   Longitude FLOAT,
   Latitude FLOAT,
   Police_Force INT,
   Accident_Severity INT,
   Number_of_Vehicles INT,
   Number_of_Casualties INT,
   Date VARCHAR(15),
   Day_of_Week INT,
   Time TIME,
   Local_Authority_District INT,
   Local_Authority_Highway VARCHAR(20),
   First_Road_Class INT,
   First_Road_Number INT,
   Road_Type INT,
   Speed limit INT,
    Junction_Detail INT,
    Junction_Control INT,
   Second_Road_Class INT,
   Second_Road_Number INT,
   Pedestrian_Crossing_Human_Control INT,
   Pedestrian_Crossing_Physical_Facilities INT,
   Light_Conditions INT,
   Weather_Conditions INT,
   Road_Surface_Conditions INT,
   Special_Conditions_at_Site INT,
   Carriageway_Hazards INT,
   Urban_or_Rural_Area INT,
   Did_Police_Officer_Attend_Scene_of_Accident INT,
   LSOA_of_Accident_Location VARCHAR(60)
);
```

 $uk_casualties$

```
--DROP TABLE uk_vehicles
CREATE TABLE uk casualties (
   Accident Index VARCHAR(20),
   Vehicle_Reference INT,
   Casualty_Reference INT,
   Casualty_Class INT,
   Sex of Casualty INT,
    Age_of_Casualty INT,
   Age_Band_of_Casualty INT,
   Casualty_Severity INT,
   Pedestrian_Location INT,
   Pedestrian_Movement INT,
   Car_Passenger INT,
   Bus_or_Coach_Passenger INT,
   Pedestrian_Road_Maintenance_Worker INT,
   Casualty_Type INT,
   Casualty_Home_Area_Type INT,
   Casualty_IMD_Decile INT,
);
```

uk vehicles

```
--DROP TABLE uk casualties
CREATE TABLE uk_vehicles (
    Accident_Index VARCHAR(20),
   Vehicle_Reference INT,
   Vehicle_Type INT,
    Towing_and_Articulation INT,
   Vehicle_Manoeuvre INT,
   Vehicle_Location_Restricted_Lane INT,
    Junction_Location INT,
   Skidding_and_Overturning INT,
   Hit_Object_in_Carriageway INT,
   Vehicle_Leaving_Carriageway INT,
   Hit_Object_off_Carriageway INT,
   First_Point_of_Impact INT,
   Was_Vehicle_Left_Hand_Drive INT,
    Journey_Purpose_of_Driver INT,
   Sex of Driver INT,
    Age_of_Driver INT,
   Age_Band_of_Driver INT,
   Engine_Capacity_CC INT,
   Propulsion_Code INT,
    Age_of_Vehicle INT,
   Driver_IMD_Decile INT,
   Driver_Home_Area_Type INT,
   Vehicle_IMD_Decile INT,
);
```

• Importing Accidents 2016 ran into an issue with Speed Limit column, where there were strings of NULL instead of true null values.

- Same issue with the 2017 Accidents in the Lat/Long columns.
- In Power Query, I ran a find/replace NULL for "" on the entire workbook.
- Accidents table: Date
 - Dates were formatted as text in dd/mm/yyyy format. When importing and converting, they were truncated. Niether Excel or SQL were playing nicely with this format.
 - In Power Query, I ran a transformation and re-saved the CSVs.
 - After some difficulty getting dates formatting, and a bit of help from Google and ChatGPT-4, the dates finally worked out.
 - The final CSV format was yyyy-mm-dd, then imported into my database as a VARCHAR
 - Then the final conversion was performed in SQL.

```
/*
I had a lot of trouble with the Date column
but finally manged to run through steps in Power Query and SQL
that worked.
--DROP TABLE uk_accidents
--Date VARCHAR(15),
--Date DATE,
SELECT Date
FROM uk_accidents
WHERE ISDATE(Date) = 0
-- Update the Date column to swap the day and month
UPDATE uk_accidents
SET Date = CONCAT(
   SUBSTRING(Date, 1, 4), '-', -- Year
   SUBSTRING(Date, 9, 2), '-', -- Day
   SUBSTRING(Date, 6, 2)
)
WHERE ISDATE(Date) = 0;
ALTER TABLE uk accidents ADD Date New DATE;
UPDATE uk_accidents SET Date_New = CAST(Date AS DATE);
--UPDATE uk_accidents SET Date_New = CONVERT(DATE, Date, 103); -- 103 is for dd/mm/yyyy format
ALTER TABLE uk_accidents DROP COLUMN Date;
EXEC sp_rename 'uk_accidents.Date_New', 'Date', 'COLUMN';
```

- Checking for duplicates in the other tables revealed that while there are duplicate Accident_Index IDs, they are not duplicate observations. Each row is a unique observation.
 - Running the following script is an example of how they are not actually duplicates:

Analysis Roadmap

- 1. Understand the Data: Make notes about each variable, what is it, what signficance does it hold, what potential calculations or analysis can be done on them.
- 2. Generate Hypotheses: What relationships, correlations, can we expect to find? Are accidents higher in certain regions, road conditions, etc? Are certain vehicles more likely to be in an accident?
- 3. Exploratory Data Analysis (EDA): Using SQL, R, and Tableau to analyze the datasets, we summarize the data and find patterns. Min, Max, Sum, Count, Mean, Median, etc. will be helpful.
- 4. Visualization: Once we have some key insights, start creating visualizations (first in R, then in Tableau) to see if anything visually stands out as interesting or if a story begins to emerge.
- 5. Story Drafting: Draft the narrative around these findings. What story is the data telling? Why is it important? What recommendations or observations can we make?
- 6. Review and Refine: Review the data story several times, refine it to make sure it's compelling and understandable. Are the visualizations telling the story on their own?
- 7. Presentation: Put all these findings into a presentation format. Keep it simple but informative. Use your visualizations to support your story. Keep the script out of the visualizations themselves but in a presentable format for those who are not able to attend the presentation.

Questions to Consider:

Conditions

- Roads: Wet/Dry, Urban/Rural, Maintained/Deferred-Maintenance,
- Cities, Regions, Police Depts, Deprivation Index, do any of these show higher accidents or lower?
- Are any types of crossings or conditions more likely to cause accidents?
- Do Seasons, Days, Times of Day, Light, or Weather play a role?

People

• Does Poverty index, age, sex, or any other human factor play a role in accidents?

Analysis

R & RStudio Transitioning to RStudio for Analysis

```
Connecting to R RStudio Loading Libraries
```

```
# LOAD LIBRARIES
library(DBI)
## Warning: package 'DBI' was built under R version 4.3.1
library(odbc)
## Warning: package 'odbc' was built under R version 4.3.1
library(RODBC)
## Warning: package 'RODBC' was built under R version 4.3.1
library(tidyverse)
## Warning: package 'tidyverse' was built under R version 4.3.1
## Warning: package 'ggplot2' was built under R version 4.3.1
## Warning: package 'lubridate' was built under R version 4.3.1
## -- Attaching core tidyverse packages ------ tidyverse 2.0.0 --
## v dplyr 1.1.2 v readr
                                  2.1.4
## v forcats 1.0.0 v stringr 1.5.0
## v ggplot2 3.4.3 v tibble 3.2.1
## v lubridate 1.9.2 v tidyr
                                  1.3.0
## v purrr
              1.0.1
## -- Conflicts ----- tidyverse conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
## i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all conflicts to become error
#library(dplyr)
#library(ggplot2)
#library(scales)
library(sqldf)
## Warning: package 'sqldf' was built under R version 4.3.1
## Loading required package: gsubfn
```

```
## Warning: package 'gsubfn' was built under R version 4.3.1

## Loading required package: proto

## Warning: package 'proto' was built under R version 4.3.1

## Loading required package: RSQLite

## Warning: package 'RSQLite' was built under R version 4.3.1

#library(ggmap)
#library(geosphere)
#library(here)
#library(skimr)
#library(janitor)
#library(Tmisc)
```

Connecting R & RStudio to the database

```
# ESTABLISH CONNECTION TO MY LOCAL DATABASE
connection <- odbcDriverConnect("driver={SQL Server};server=LAPTOP-76LHVPRQ\\SQLEXPRESS;database=UK_Roa</pre>
```

Assign Dataframes Assigning the new cleaned database tables as R dataframes:

- UK_AccidentData
- UK_CasualtyData
- UK_VehicleData

```
# ASSIGN THE DATABASE TABLE AS A DATAFRAME (df) VARIABLE FOR EASIER RECALL

UK_AccidentData <- sqlFetch(connection, "dbo.uk_accidents")

UK_CasualtyData <- sqlFetch(connection, "dbo.uk_casualties")

UK_VehicleData <- sqlFetch(connection, "dbo.uk_vehicles")</pre>
```

Column Names (Variables)

- What variables do each dataset contain?
- How are they related?
- What might they tell us?

The Accident Index acts as a key. The Accident Table is the key table, there is one Accident Index for each observation (row) in this table. The Casualty and Vehicle tables refer back to this Accident Index key to tie their data into specific accidents. The Number of Vehicles and Number of Casualties are essentially a count of the other related data from the other two tables.

The Vehicle Reference builds on the Accident Index. It is contained in both the Vehicle Table and Casualty Table. For each accident, individual vehicles are numbered (Vehicle 1, Vehicle 2, etc.). This allows us to see how many vehicles were involved in any given accident (from the Vehicle Table) while maintaining a simple Accident Index in the origin table. The Casualty Table can then assign the casualty to which vehicle was involved in that injury.

The Casualty Reference only exists on the Casualty Table, and serves as an index for the individual who was injured.

There are also Key Tables/Codes Tables. During my work in R, I will reference them via CSV/Excel to understand what each one is, as I do not need them for determining averages or means or counts. However, when visualizing this data, I will import these into Tableau in a star schema for more accurate labeling.

colnames(UK_AccidentData)

```
##
    [1] "Accident_Index"
##
       "Location_Easting_OSGR"
##
    [3]
        "Location_Northing_OSGR"
##
    [4]
       "Longitude"
    [5] "Latitude"
##
    [6] "Police_Force"
##
        "Accident_Severity"
##
        "Number_of_Vehicles"
##
##
        "Number of Casualties"
## [10]
        "Day_of_Week"
##
   Γ117
        "Time"
   [12] "Local_Authority_District"
   [13] "Local Authority Highway"
   [14] "First Road Class"
        "First_Road_Number"
##
   Γ15]
   [16]
        "Road_Type"
   [17]
        "Speed_limit"
   [18]
        "Junction_Detail"
   [19]
##
        "Junction_Control"
   [20]
        "Second Road Class"
   [21]
        "Second_Road_Number"
##
        "Pedestrian_Crossing_Human_Control"
##
   [22]
   [23]
        "Pedestrian_Crossing_Physical_Facilities"
##
  [24]
        "Light_Conditions"
  [25] "Weather Conditions"
##
   [26]
        "Road Surface Conditions"
##
   [27]
        "Special_Conditions_at_Site"
   [28]
       "Carriageway_Hazards"
        "Urban_or_Rural_Area"
   [29]
   [30] "Did_Police_Officer_Attend_Scene_of_Accident"
   [31] "LSOA of Accident Location"
  [32] "Date"
## [33] "TimeGroup"
```

colnames(UK_CasualtyData)

```
##
    [1] "Accident_Index"
                                               "Vehicle_Reference"
    [3] "Casualty_Reference"
                                               "Casualty_Class"
##
    [5] "Sex_of_Casualty"
                                               "Age of Casualty"
    [7] "Age_Band_of_Casualty"
                                               "Casualty_Severity"
##
    [9] "Pedestrian_Location"
                                               "Pedestrian_Movement"
##
##
   [11] "Car_Passenger"
                                               "Bus_or_Coach_Passenger"
   [13] "Pedestrian_Road_Maintenance_Worker"
                                               "Casualty_Type"
                                               "Casualty_IMD_Decile"
   [15] "Casualty Home Area Type"
```

colnames(UK_VehicleData)

```
##
    [1] "Accident_Index"
                                            "Vehicle_Reference"
##
    [3] "Vehicle_Type"
                                            "Towing_and_Articulation"
                                            "Vehicle Location Restricted Lane"
##
    [5] "Vehicle Manoeuvre"
    [7] "Junction Location"
                                            "Skidding and Overturning"
##
    [9] "Hit Object in Carriageway"
                                            "Vehicle Leaving Carriageway"
## [11] "Hit_Object_off_Carriageway"
                                            "First_Point_of_Impact"
## [13] "Was_Vehicle_Left_Hand_Drive"
                                            "Journey_Purpose_of_Driver"
## [15] "Sex_of_Driver"
                                            "Age_of_Driver"
                                            "Engine Capacity CC"
## [17] "Age_Band_of_Driver"
  [19] "Propulsion_Code"
                                            "Age_of_Vehicle"
  [21] "Driver_IMD_Decile"
                                            "Driver_Home_Area_Type"
## [23] "Vehicle_IMD_Decile"
```

UK_Road Safety Data Summary In comparing certain variable's mean and median, we can make some preliminary statements.

Summary of UK Accidents

- Accident Severity Code 3 is Slight. The Median (3) and Mean (2.81) indicate that the average accident only presents Slight injuries.
- Most accidents involve two vehicles and do involve at least one injury.
- Day of Week: I'd like to see a visual count on this for the "difference" but most accidents occur on a Wednesday (Median 4, Mean 4.104, Code 4 is Wednesday).
- The Mean (37.64) and Median (30) speed limits may indicate the "average" accident occurs at these lower limits. However, a count graphic may indicate whether there was a slight difference or major difference in accidents counts for each limit range.
- Light Conditions. Code 1 is light, Codes 4-7 indicate various lighting conditions in the dark. The Median (1) and Mean (1.993) may indicate the average accident occurs during the day or with good lighting. Graphing this data may help illuminate this key.
- Weather Conditions. Code 1 is Fine. Codes 2-8 are other than fine. 9 is unknown. Median (1) and Mean (1.579) indicate weather is not a major influence "on average", but graphing this will show any trends or difference in the data.

• Police Attendance would be an after-the-fact variable, so while it may indicate the seriousness of the accident, it would not be predictive in any way for preventing accidents. That being said, it does appear the police were involved in the average accident, Median (1), Mean (1.251), with Code 1 being Yes, and Code 2 being No.

Summary of UK Accident Casualty

Note: By "Casualty", this dataset means "Injury" not necessarily "Death". They are segregated into Fatality, Serious, and Slight.

- Sex of Casualty Code 1, Male, Code 2, Female. Median (1), Mean (1.406); this does not tell me much right now. I'd like to see the data visualized and see if this acts as a component against or with other variables.
- Age of Casualty: Median 33, Mean 36.48. This does seem to indicate something. Although, this is the prime working age, so it's possible this has to do with the number of humans in this age range in the vicinity and not anything to do with their driving. High probability with higher representation. As with the other table, when a casualty is involved, it appears to be serious or slight, but Fatalities are not the average. Although, with the Insurance rates higher for "teens" I would have expected this to trend that direction. I would like to see the full variable visualized.
- Pedestrian Location & Movement reflect Median of 0, and Mean of 0.714/0.5418. Pedestrians are rarely involved.
- Road Maintenance workers are rarely involved. Although, if a road working company wanted to analyze
 the data for situations in which they could reduce their workers being hurt, they could slice the data
 for only these situations and see what trends emerge.
- Home Area (1 Urban, 2 Small Town, 3 Rural) Urban cities seem to be the average place for accidents.
- IMD 4/3.714 may indicate a trend toward more casualties in mid-lower income regions? Needs further visualization analysis.

Summary of UK Vehicles in Accidents

- Vehicle Type 9/9.804 is Car. Most people on most trips are in a car, so this holds to the expected pattern. Could be interesting to visualize this data variable to see what the second or third most common types are. Motorcycle, Van, Taxi, etc.
- !!! Manoeuvre (Reversing, Parked, Waiting, Slowing, U-Turn, etc.). Anecdotally, when I was a young driver most of my accidents were in parking lots while reversing. I later learned this is common for ADHD neurotypes. This may be interesting to follow.
- Vehicle Location Median 0 means the central data point is on the main roads. Not surprising.
- Junction Median of 1 (Approaching or waiting at a junction) may indicate this is a common place for accidents. I was rear-ended more than once while waiting at a stoplight.
- Journey or Purpose Unknown (6) may make this a useless variable?
- Several variables show no indication of relevance, all being zero median.
- Age of Driver (35/35.49) matches the Casualty table. Interesting.
- Propulsion Code Mostly Gasoline/Petrol cars. Not shocking.

- Age of Vehicle Average car was 5.569 years old. That's may be a reflection of the average age of cars in general, and may only be relevant to the accident data if this was compared to the general average age of cars in the UK. If they were divergent, then it would be relevant. Otherwise it is a reflection and not indicative of anything useful.
- Engine Capacity CC Median (1390), Mean (1422) actually mean nothing to me because I don't know anything about Engine CCs or how that's relevant. And as with Age of Vehicle, may be a reflection and not an indication.

summary(UK_AccidentData)

```
Accident_Index
                        Location_Easting_OSGR Location_Northing_OSGR
##
    Length: 529294
                                : 70860
                                                        : 10235
                                                Min.
                                                1st Qu.: 176240
##
    Class : character
                        1st Qu.:386552
##
         :character
                                                Median: 231908
                        Median: 455233
##
                                                          286296
                        Mean
                                :449456
                                                Mean
##
                                                3rd Qu.: 389580
                        3rd Qu.:528110
##
                        Max.
                                :655391
                                                Max.
                                                        :1209512
##
                        NA's
                                :108
                                                NA's
                                                        :108
##
                                          Police Force
      Longitude
                           Latitude
                                                          Accident_Severity
##
    Min.
            :-7.4229
                       Min.
                               :49.91
                                        Min.
                                                : 1.00
                                                          Min.
                                                                  :1.00
                                                          1st Qu.:3.00
##
    1st Qu.:-2.2016
                       1st Qu.:51.47
                                         1st Qu.: 6.00
##
    Median :-1.1849
                       Median :51.97
                                         Median :30.00
                                                          Median:3.00
##
    Mean
            :-1.2934
                       Mean
                               :52.46
                                         Mean
                                                :29.19
                                                          Mean
                                                                  :2.81
##
    3rd Qu.:-0.1533
                       3rd Qu.:53.40
                                         3rd Qu.:45.00
                                                          3rd Qu.:3.00
##
    Max.
            : 1.7596
                       Max.
                               :60.76
                                         Max.
                                                :98.00
                                                          Max.
                                                                  :3.00
##
    NA's
            :118
                       NA's
                               :118
##
    Number_of_Vehicles Number_of_Casualties Day_of_Week
                                                                     Time
##
    Min.
           : 1.000
                        Min.
                                : 1.000
                                               Min.
                                                       :1.000
                                                                 Length: 529294
##
    1st Qu.: 1.000
                        1st Qu.: 1.000
                                               1st Qu.:2.000
                                                                 Class : character
##
    Median : 2.000
                        Median : 1.000
                                               Median :4.000
                                                                 Mode : character
           : 1.843
                                                       :4.104
##
    Mean
                        Mean
                                : 1.321
                                               Mean
##
    3rd Qu.: 2.000
                        3rd Qu.: 1.000
                                               3rd Qu.:6.000
##
            :37.000
                                :59.000
                                                       :7.000
                        Max.
                                               Max.
##
##
    Local Authority District Local Authority Highway First Road Class
##
    Min.
           : 1
                               Length: 529294
                                                         Min.
                                                                 :1.00
##
    1st Qu.: 95
                               Class : character
                                                         1st Qu.:3.00
    Median:307
                                                         Median:4.00
##
                               Mode
                                     :character
##
    Mean
            :336
                                                         Mean
                                                                 :4.17
##
    3rd Qu.:514
                                                         3rd Qu.:6.00
##
    Max.
            :941
                                                         Max.
                                                                 :6.00
##
##
    First_Road_Number
                                           Speed_limit
                                                           Junction_Detail
                          Road_Type
##
    Min.
                0.0
                               :-1.000
                                          Min.
                                                 : 0.00
                                                           Min.
                                                                   :-1.000
                       1st Qu.: 6.000
##
    1st Qu.:
                0.0
                                          1st Qu.:30.00
                                                           1st Qu.: 0.000
##
    Median :
               60.0
                       Median : 6.000
                                          Median :30.00
                                                           Median : 1.000
##
    Mean
            : 900.5
                               : 5.175
                                                 :37.64
                       Mean
                                          Mean
                                                           Mean
                                                                   : 2.252
    3rd Qu.: 630.0
                       3rd Qu.: 6.000
                                          3rd Qu.:40.00
                                                           3rd Qu.: 3.000
##
    Max.
            :9918.0
                       Max.
                               : 9.000
                                          Max.
                                                 :70.00
                                                           Max.
                                                                   : 9.000
##
                                          NA's
                                                 :37
##
    Junction_Control Second_Road_Class
                                         Second_Road_Number
            :-1.000
                      Min.
                              :-1.000
                                          Min.
                                                 : -1.0
##
    1st Qu.:-1.000
                      1st Qu.:-1.000
                                          1st Qu.:
                                                      0.0
```

```
## Median : 2.000
                    Median : 3.000
                                     Median :
                                                0.0
                         : 2.647
  Mean : 1.657
                                     Mean : 320.6
                    Mean
   3rd Qu.: 4.000
                    3rd Qu.: 6.000
                                     3rd Qu.:
                                                0.0
## Max. : 4.000
                    Max. : 6.000
                                     Max.
                                            :9999.0
##
  Pedestrian_Crossing_Human_Control Pedestrian_Crossing_Physical_Facilities
          :-1.000000
                                           :-1.0000
                                    Min.
  1st Qu.: 0.000000
                                    1st Qu.: 0.0000
##
## Median: 0.000000
                                    Median: 0.0000
## Mean : 0.004485
                                    Mean : 0.8375
   3rd Qu.: 0.000000
                                    3rd Qu.: 0.0000
## Max. : 2.000000
                                    Max. : 8.0000
##
## Light_Conditions Weather_Conditions Road_Surface_Conditions
## Min. :-1.000
                    Min.
                         :-1.000
                                      Min. :-1.000
## 1st Qu.: 1.000
                    1st Qu.: 1.000
                                      1st Qu.: 1.000
## Median : 1.000
                    Median : 1.000
                                      Median : 1.000
## Mean : 1.993
                    Mean : 1.579
                                      Mean : 1.286
  3rd Qu.: 4.000
                    3rd Qu.: 1.000
                                      3rd Qu.: 2.000
## Max. : 7.000
                    Max. : 9.000
                                      Max. : 5.000
##
## Special_Conditions_at_Site Carriageway_Hazards Urban_or_Rural_Area
## Min.
         :-1.00000
                                   :-1.00000
                                                      :-1.000
                             Min.
                                                Min.
## 1st Qu.: 0.00000
                             1st Qu.: 0.00000
                                                 1st Qu.: 1.000
## Median : 0.00000
                             Median : 0.00000
                                                Median : 1.000
## Mean : 0.08348
                             Mean : 0.05296
                                                Mean : 1.338
##
   3rd Qu.: 0.00000
                             3rd Qu.: 0.00000
                                                 3rd Qu.: 2.000
## Max. : 7.00000
                             Max. : 7.00000
                                                Max. : 3.000
##
## Did_Police_Officer_Attend_Scene_of_Accident LSOA_of_Accident_Location
## Min. :-1.000
                                              Length: 529294
## 1st Qu.: 1.000
                                              Class : character
## Median : 1.000
                                              Mode :character
## Mean : 1.251
   3rd Qu.: 1.000
## Max. : 3.000
##
##
                       TimeGroup
       Date
   Length: 529294
                      Length: 529294
##
   Class : character
                      Class : character
   Mode :character Mode :character
##
##
##
##
```

summary(UK_CasualtyData)

```
Accident Index
                     Vehicle_Reference Casualty_Reference Casualty_Class
## Length:699163
                     Min. : 1.000
                                      Min. : 1.000
                                                        Min.
                                                              :1.00
## Class :character
                     1st Qu.: 1.000
                                      1st Qu.: 1.000
                                                        1st Qu.:1.00
## Mode :character
                     Median : 1.000
                                      Median : 1.000
                                                        Median:1.00
##
                     Mean : 1.488
                                      Mean : 1.406
                                                        Mean :1.49
##
                     3rd Qu.: 2.000
                                      3rd Qu.: 2.000
                                                        3rd Qu.:2.00
```

```
##
                            :999.000 Max.
                                              :991.000
                                                         Max.
   Sex of Casualty
                   Age_of_Casualty Age_Band_of_Casualty Casualty_Severity
  Min. :-1.000
                    Min. : -1.00
                                    Min. :-1.000
                                                        Min. :1.000
  1st Qu.: 1.000
                    1st Qu.: 22.00
##
                                    1st Qu.: 5.000
                                                        1st Qu.:3.000
   Median : 1.000
                    Median : 33.00
                                    Median : 6.000
                                                        Median :3.000
##
   Mean
         : 1.406
                         : 36.48
                                   Mean
                                          : 6.289
                                                        Mean
                                                             :2.842
                    Mean
   3rd Qu.: 2.000
                    3rd Qu.: 50.00
                                    3rd Qu.: 8.000
                                                        3rd Qu.:3.000
  Max. : 2.000
##
                    Max.
                          :104.00
                                   Max.
                                           :11.000
                                                        Max.
                                                               :3.000
   Pedestrian Location Pedestrian Movement Car Passenger
                      Min. :-1.0000
##
   Min. :-1.000
                                                 :-1.0000
                                          Min.
   1st Qu.: 0.000
                       1st Qu.: 0.0000
                                          1st Qu.: 0.0000
                       Median : 0.0000
                                          Median : 0.0000
##
  Median : 0.000
   Mean
         : 0.714
                       Mean
                             : 0.5418
                                          Mean
                                                : 0.2523
                       3rd Qu.: 0.0000
##
   3rd Qu.: 0.000
                                          3rd Qu.: 0.0000
  Max.
         :10.000
                       Max.
                             : 9.0000
                                          Max. : 2.0000
   Bus_or_Coach_Passenger Pedestrian_Road_Maintenance_Worker Casualty_Type
   Min. :-1.00000
                         Min. :-1.00000
                                                           Min. :-1.000
                         1st Qu.: 0.00000
   1st Qu.: 0.00000
                                                           1st Qu.: 3.000
  Median: 0.00000
                         Median: 0.00000
                                                           Median: 9.000
                                                           Mean : 7.281
## Mean : 0.07744
                         Mean : 0.07626
                         3rd Qu.: 0.00000
##
   3rd Qu.: 0.00000
                                                           3rd Qu.: 9.000
  Max. : 4.00000
                         Max. : 2.00000
                                                           Max.
                                                                 :98.000
   Casualty_Home_Area_Type Casualty_IMD_Decile
   Min. :-1.000
                          Min. :-1.000
                          1st Qu.: 1.000
##
  1st Qu.: 1.000
  Median : 1.000
                          Median: 4.000
## Mean : 0.986
                          Mean : 3.714
   3rd Qu.: 1.000
                          3rd Qu.: 7.000
## Max. : 3.000
                          Max. :10.000
```

summary(UK VehicleData)

```
Accident_Index
                      Vehicle_Reference Vehicle_Type
                                                       Towing_and_Articulation
  Length: 975680
                      Min. : 1.000
                                       Min.
                                             :-1.000
                                                       Min. :-1.00000
## Class :character
                      1st Qu.: 1.000
                                                        1st Qu.: 0.00000
                                       1st Qu.: 9.000
   Mode :character
                      Median : 1.000
                                       Median : 9.000
                                                       Median: 0.00000
##
                      Mean : 1.562
                                       Mean : 9.804
                                                       Mean : 0.02147
##
                      3rd Qu.: 2.000
                                       3rd Qu.: 9.000
                                                        3rd Qu.: 0.00000
##
                            :999.000
                                       Max. :98.000
                                                       Max. : 5.00000
                      Max.
##
   Vehicle_Manoeuvre Vehicle_Location_Restricted_Lane Junction_Location
   Min. :-1.00
                     Min. :-1.0000
                                                    Min.
                                                          :-1.000
   1st Qu.: 6.00
                     1st Qu.: 0.0000
                                                     1st Qu.: 0.000
##
  Median :17.00
                     Median : 0.0000
                                                     Median : 1.000
   Mean :12.43
                     Mean : 0.1404
                                                     Mean : 2.441
##
   3rd Qu.:18.00
                     3rd Qu.: 0.0000
                                                     3rd Qu.: 5.000
  Max. :18.00
                     Max. : 9.0000
                                                    Max. : 8.000
   Skidding_and_Overturning Hit_Object_in_Carriageway Vehicle_Leaving_Carriageway
                           Min. :-1.0000
  Min. :-1.0000
                                                    Min. :-1.0000
   1st Qu.: 0.0000
                           1st Qu.: 0.0000
                                                     1st Qu.: 0.0000
                           Median : 0.0000
## Median: 0.0000
                                                    Median: 0.0000
## Mean : 0.1827
                           Mean : 0.2983
                                                    Mean : 0.3094
##
   3rd Qu.: 0.0000
                           3rd Qu.: 0.0000
                                                     3rd Qu.: 0.0000
## Max. : 5.0000
                           Max.
                                  :12.0000
                                                    Max.
                                                          : 8.0000
## Hit_Object_off_Carriageway First_Point_of_Impact Was_Vehicle_Left_Hand_Drive
```

```
:-1.0000
                                        :-1.000
                                                               :-1.0000
##
    Min.
                                Min.
    1st Qu.: 0.0000
                                                        1st Qu.: 1.0000
##
                                1st Qu.: 1.000
##
    Median: 0.0000
                                Median : 1.000
                                                        Median: 1.0000
##
           : 0.4375
                                        : 1.754
                                                               : 0.9695
    Mean
                                Mean
                                                        Mean
##
    3rd Qu.: 0.0000
                                3rd Qu.: 3.000
                                                        3rd Qu.: 1.0000
##
                                                                : 2.0000
    Max.
           :11.0000
                                Max.
                                        : 4.000
                                                        Max.
    Journey Purpose of Driver Sex of Driver
##
                                                  Age of Driver
                                                                    Age Band of Driver
           :-1.000
##
    Min.
                               Min.
                                       :-1.000
                                                 Min.
                                                         : -1.00
                                                                    Min.
                                                                           :-1.000
##
    1st Qu.: 2.000
                               1st Qu.: 1.000
                                                  1st Qu.: 23.00
                                                                    1st Qu.: 5.000
##
    Median : 6.000
                               Median : 1.000
                                                  Median: 35.00
                                                                    Median : 6.000
    Mean
           : 4.714
                               Mean
                                       : 1.432
                                                  Mean
                                                         : 35.49
                                                                    Mean
                                                                           : 5.959
##
    3rd Qu.: 6.000
                               3rd Qu.: 2.000
                                                  3rd Qu.: 50.00
                                                                    3rd Qu.: 8.000
##
    Max.
           : 6.000
                               Max.
                                       : 3.000
                                                 Max.
                                                         :101.00
                                                                    Max.
                                                                           :11.000
##
    Engine_Capacity_CC Propulsion_Code
                                          Age_of_Vehicle
                                                             Driver_IMD_Decile
##
               -1
                                :-1.000
                                                  : -1.000
                                                                     :-1.000
    Min.
           :
                        Min.
                                          Min.
                                                             Min.
##
    1st Qu.:
              113
                        1st Qu.: 1.000
                                          1st Qu.: -1.000
                                                             1st Qu.:-1.000
##
                        Median : 1.000
    Median: 1390
                                          Median : 5.000
                                                             Median : 1.000
           : 1422
##
    Mean
                        Mean
                               : 0.936
                                                  : 5.569
                                                                     : 2.206
                                          Mean
                                                             Mean
                        3rd Qu.: 2.000
##
    3rd Qu.: 1910
                                          3rd Qu.: 10.000
                                                             3rd Qu.: 5.000
##
    Max.
           :99999
                        Max.
                                :12.000
                                                  :105.000
                                                             Max.
                                                                     :10.000
##
    Driver_Home_Area_Type Vehicle_IMD_Decile
##
           :-1.0000
                           Min.
                                   :-1.000
    1st Qu.: 1.0000
##
                           1st Qu.:-1.000
    Median: 1.0000
                           Median: 1.000
##
                                 : 2.206
##
    Mean
           : 0.8256
                           Mean
    3rd Qu.: 1.0000
                           3rd Qu.: 5.000
##
           : 3.0000
                                   :10.000
    Max.
                           Max.
```

New Questions

Based on the summary review, here are some questions to pursue.

- Accidents Table
 - How many accidents involve 0, 1, 2, or more vehicles?
 - How many accidents involve a casualty/injury of any kind?
 - How many accidents occur at various speed limit ranges?
 - How many accidents occur on which days of the week?
 - How many accidents occur at various light conditions?
 - How many accidents occur at various weather conditions?
 - How many accidents for each IMD?
- Casualty Table
 - How many casualties for each sex/gender?
 - How many casualties for each age band?
 - How many casualties for each Home Areas?
 - How many casualties for each IMD?
- Vehicles Table
 - How many of each vehicle type? We know cars are most common, but which are 2nd or 3rd?
 - Which Manoeuvres are most common?
 - Besides main roads, which other Locations are common?

- Explore variables, see what else sticks out.

UK_AccidentData Variable Analysis

The following represents a look at the counts for occurrences of variables in the UK_AccidentData dataset. Comments above each represent findings.

```
# As expected, most accidents involved two vehicles, then one, then three.
# Numbers drop off significantly after this.
UK_AccidentData %>%
    count(Number_of_Vehicles)
```

```
##
      Number_of_Vehicles
## 1
                         1 155544
## 2
                         2 319053
## 3
                         3
                            42056
## 4
                         4
                              9372
## 5
                         5
                              2182
## 6
                         6
                               637
## 7
                         7
                               256
                         8
## 8
                                87
                         9
## 9
                                51
## 10
                        10
                                27
## 11
                        11
                                 9
## 12
                        12
                                 4
## 13
                        13
                                 3
                        14
## 14
                                 3
## 15
                        15
                                 1
## 16
                        16
                                 5
## 17
                        18
                                 1
## 18
                        23
                                 1
## 19
                        24
                                 1
                        37
## 20
```

```
# At first glance, this doesn't appear to say much. Weekends are fewer.
UK_AccidentData %>%
count(Day_of_Week)
```

```
##
     Day_of_Week
## 1
               1 59060
## 2
               2 74984
## 3
               3 78967
## 4
               4 79955
## 5
               5 80881
## 6
               6 86219
               7 69228
## 7
```

```
# There are a LOT more accidents at 30 MPH than at any other speed limit.

UK_AccidentData %>%

count(Speed_limit)
```

```
Speed_limit
## 1
              0
                      1
## 2
              10
## 3
              20 31333
## 4
             30 327671
## 5
             40 44098
## 6
             50 21652
              60 69574
## 7
## 8
              70 34926
## 9
              NA
                     37
# The vast majority of accidents occur during the day (when most are driving)
# Next is darkness in well lit aready (again, where most people are driving)
UK_AccidentData %>%
count(Light_Conditions)
##
    Light_Conditions
## 1
## 2
                    1 382690
## 3
                    4 106713
## 4
                    5
                       3362
## 5
                    6 27075
                    7
## 6
                        9440
# The lion share of accidents occur when weather is fine (when most people are driving)
# Of the remaining, the most occur in rain.
UK AccidentData %>%
count(Weather_Conditions)
##
      Weather_Conditions
## 1
                      -1
                             33
## 2
                       1 430121
## 3
                       2 57140
## 4
                       3
                           2602
## 5
                           5990
## 6
                       5
                           6130
## 7
                       6
                           755
## 8
                      7
                           2480
## 9
                       8
                          9507
## 10
                       9 14536
# Not useful, needs better grouping.
#UK_AccidentData %>%
# count(Time)
# This will be very useful for Visualization in Tableau,
# added this new column to table in SQL
UK_AccidentData %>%
  mutate(TimeGroup = case_when(
    Time >= "06:00:00.0000000" & Time < "9:00:00.0000000" ~ "Morning_Commute",
    Time >= "09:00:00.0000000" & Time < "11:00:00.0000000" ~ "Morning_Late",
```

```
Time \geq "11:00:00.0000000" & Time < "13:00:00.0000000" ~ "Lunch_Hours",
    Time >= "13:00:00.0000000" & Time < "17:00:00.0000000" ~ "Afternoon",
    Time \geq= "17:00:00.0000000" & Time < "20:00:00.0000000" ~ "Evening_Commute",
    Time >= "20:00:00.0000000" & Time < "21:00:00.0000000" ~ "Evening_Late",
    TRUE ~ "Late_Night"
  )) %>%
  count(TimeGroup)
##
           TimeGroup
## 1
         Late_Night 28984
## 2 Morning_Commute 500310
\# Most accidents occur in the Afternoon (1p-5p)
# Second most occur during the evening commute (5p-8p)
UK AccidentData %>%
count(TimeGroup)
##
           TimeGroup
## 1
           Afternoon 147299
## 2 Evening_Commute 112939
## 3
       Evening Late 20148
## 4
        Late_Night 69267
## 5
       Lunch Hours 57138
## 6 Morning_Commute 73060
## 7
       Morning_Late 49443
# The following three seem evenly dispersed.
# Maybe let's get a dashboard with these?
# See if anything pops out visually?
# Seems fairly evenly dispersed?
UK_AccidentData %>%
  count(Police_Force) %>%
  arrange(-n) %>%
head(10)
      Police_Force
                1 101812
## 1
## 2
               20 23173
## 3
               46 19116
               13 18757
## 4
               43 18022
## 5
## 6
               44 16770
## 7
               47 16216
## 8
               50 14458
## 9
               45 14215
## 10
               4 14120
# Seems fairly evenly dispersed?
```

```
UK_AccidentData %>%
  count(Local_Authority_District) %>%
  arrange(-n) %>%
  head(10)
      Local_Authority_District
##
## 1
                           300 11095
## 2
                           204 7164
## 3
                             1 6319
## 4
                             9 5114
## 5
                           596 4759
                           926 4456
## 6
                             5 4405
## 7
## 8
                           200 4375
## 9
                           215 4375
## 10
                             8 4160
# Seems fairly evenly dispersed?
UK_AccidentData %>%
  count(Local_Authority_Highway) %>%
  arrange(-n) %>%
head(10)
##
      Local_Authority_Highway
## 1
                    E10000016 16625
## 2
                    E10000030 14215
## 3
                    E10000012 11190
## 4
                    E10000014 11130
## 5
                    E08000025 11095
## 6
                    E10000017 11089
## 7
                    E10000015 9447
## 8
                    E10000019 7912
## 9
                    E10000032 7862
## 10
                    E08000035 7164
\# No Intersection \& T Intersections are most common accident types.
# That is surprising, given the MPH 30 thing? Let's look at MPH, Junctions, and Time.
UK_AccidentData %>%
count(Junction_Detail)
##
      Junction_Detail
                           n
## 1
                   -1
                        1488
## 2
                    0 218682
## 3
                    1
                      44888
## 4
                    2
                        6698
## 5
                    3 162272
## 6
                    5
                       7828
## 7
                    6 50729
## 8
                    7
                       5077
## 9
                    8 15585
## 10
                    9 16047
```

```
# Mostly missing data (-1)
UK_AccidentData %>%
count(Junction_Control)
##
     Junction_Control
## 1
                   -1 223831
## 2
                   0
                        388
## 3
                       1375
                   1
## 4
                   2 56285
## 5
                    3
                      2945
## 6
                    4 244470
# Mostly missing data (-1), filter these out.
# With (-1, missing data) filtered out, these show a strong preference for 4.
# Uncontroled intersections lead the way.
UK_AccidentData %>%
 filter(Junction_Control != -1) %>%
count(Junction_Control)
##
     Junction_Control
## 1
                   0
                         388
## 2
                       1375
                   1
## 3
                   2 56285
## 4
                       2945
## 5
                    4 244470
# One lane roads dominate
UK_AccidentData %>%
count(Road_Type)
##
   Road_Type
## 1
       -1
                    1
## 2
           1 34444
            2 12742
## 3
## 4
            3 80196
## 5
            6 388887
## 6
            7
                5875
## 7
            9
                7149
# Most accidents (383,735) occurred on dry roads.
# 2nd Most (131,236) on wet roads.
# As these are the two most common road conditions, that is only so helpful to know.
UK_AccidentData %>%
count(Road_Surface_Conditions)
##
    Road_Surface_Conditions
## 1
                               4213
## 2
                          1 383735
## 3
                           2 131236
## 4
                           3
                             2325
## 5
                             7205
## 6
                               580
                          5
```

```
# Roughly 3/4 of accidents had a Police Officer
# Roughly 1/4 did not
# A fraction had no police officer but did self-report via a form.
UK_AccidentData %>%
  count(Did_Police_Officer_Attend_Scene_of_Accident)
     Did_Police_Officer_Attend_Scene_of_Accident
##
                                                       n
## 1
                                                      10
                                                1 399445
## 2
## 3
                                                2 126704
## 4
                                                    3135
```

UK_CasualtyData Variable Analysis

The following represents a look at the counts for occurrences of variables in the UK_CasualtyData dataset. Comments above each represent findings.

```
# UK_CasualtyData
colnames(UK_CasualtyData)
   [1] "Accident_Index"
                                              "Vehicle_Reference"
##
   [3] "Casualty_Reference"
                                              "Casualty_Class"
  [5] "Sex_of_Casualty"
                                              "Age_of_Casualty"
##
   [7] "Age_Band_of_Casualty"
                                              "Casualty_Severity"
##
  [9] "Pedestrian_Location"
                                              "Pedestrian_Movement"
##
## [11] "Car_Passenger"
                                              "Bus_or_Coach_Passenger"
## [13] "Pedestrian_Road_Maintenance_Worker"
                                             "Casualty_Type"
## [15] "Casualty_Home_Area_Type"
                                              "Casualty_IMD_Decile"
# Roughly double M vs F
UK_CasualtyData %>%
  count(Sex_of_Casualty)
    Sex_of_Casualty
##
                          n
## 1
                  -1
                        180
                   1 414486
## 2
## 3
                   2 284497
# The data set is too long, using age bands is better.
# Unlike the Time in the Accident table, this one is already grouped.
#UK_CasualtyData %>%
 # count(Age_of_Casualty)
# Probably a bell curve?
# Highest at 6 (26-35) and 7 (36-45) with tapering on both sides.
# Probably a reflection of the age average among the general population.
UK CasualtyData %>%
  count(Age_Band_of_Casualty)
```

```
Age_Band_of_Casualty
##
## 1
                       -1 10942
## 2
                        1 13262
## 3
                        2 19412
                        3 29392
## 4
                        4 74991
## 5
## 6
                        5 86653
                        6 142824
## 7
                        7 105425
## 8
## 9
                        8 97143
                        9 57019
## 10
## 11
                       10 34093
## 12
                       11 28007
# Casualties roughly divided between Vehicle 1 & 2
\# Some casualties in multi-car crashes, with fewer and fewer the more cars involved.
# As expected.
UK_CasualtyData %>%
count(Vehicle_Reference)
```

##	Vehicle Reference	n
## 1	1	392140
## 2	2	281738
## 3	3	20406
## 4	4	3584
## 5	5	770
## 6	6	277
## 7	7	107
## 8	8	52
## 9	9	22
## 10	10	17
## 11	11	4
## 12	12	5
## 13	13	5
## 14	14	4
## 15	15	3
## 16	16	5
## 17	18	2
## 18	19	1
## 19	20	2
## 20	21	3
## 21	22	4
## 22	23	1
## 23	24	2
## 24	25	1
## 25	26	1
## 26	27	3
## 27	28	1
## 28	32	1
## 29	101	1
## 30	999	1

```
# Most casualties "Not Car Passenger"?
# Does that mean they weren't in THIS car, or weren't in any car?
# Does that mean most were pedestrians? But that doesn't align with other data?
UK_CasualtyData %>%
  count(Car_Passenger)
    Car_Passenger
## 1
                -1
                     1828
## 2
                 0 567397
## 3
                 1 81621
## 4
                 2 48317
# Most (vast majority) not a Pedestrian, as stated above.
UK_CasualtyData %>%
count(Pedestrian_Location)
##
      Pedestrian_Location
## 1
                              11
## 2
                        0 605313
## 3
                        1 14376
## 4
                        2
                             439
## 5
                             214
                        3
## 6
                           7227
                        4
## 7
                        5 40928
## 8
                        6
                           9725
## 9
                        7
                            490
## 10
                        8
                           3370
## 11
                            9642
                        9
## 12
                       10
                            7428
# Most (vast majority) not a Pedestrian, as stated above.
UK_CasualtyData %>%
count(Pedestrian_Movement)
##
      Pedestrian_Movement
                               n
## 1
                              16
                       -1
                        0 605311
## 2
## 3
                        1 32064
## 4
                           6550
## 5
                        3 19377
## 6
                           4356
                        4
## 7
                           4608
                        5
## 8
                        6
                            727
## 9
                        7
                            1273
## 10
                           2134
## 11
                        9 22747
# Vast majority not a bus or coach passenger, as expected.
UK_CasualtyData %>%
  count(Bus_or_Coach_Passenger)
```

```
Bus_or_Coach_Passenger
                               n
                              163
## 1
                         -1
## 2
                         0 683507
## 3
                              619
                         1
                         2
## 4
                              692
## 5
                         3
                             4426
## 6
                             9756
# Urban 485,508
# Small Town 52,300
# Rural 65,163
# Large number no data
UK_CasualtyData %>%
count(Casualty_Home_Area_Type)
     Casualty_Home_Area_Type
## 1
                         -1 96192
## 2
                          1 485508
## 3
                          2 52300
## 4
                          3 65163
# For those with data, seems evenly spread Poverty to Affluent
UK_CasualtyData %>%
count(Casualty_IMD_Decile)
##
      Casualty_IMD_Decile
## 1
                       -1 151742
## 2
                       1 65220
## 3
                       2 67435
## 4
                       3 64260
## 5
                       4 60894
## 6
                       5 56618
## 7
                       6 53529
## 8
                       7 49743
                       8 46876
## 9
## 10
                       9 44246
## 11
                      10 38600
# Driver 450,659
# Passenger 154,656
# Pedestrian 93,848
UK_CasualtyData %>%
count(Casualty_Class)
## Casualty_Class
## 1
                 1 450659
## 2
                 2 154656
## 3
                 3 93848
# Fatality 7,099
# Seriously Injured 96,587
# Slight Injury 595,477
```

```
# This rings true to logic, but I actually thought fatalities would have been higher.
UK_CasualtyData %>%
  count(Casualty_Severity)
##
     Casualty_Severity
## 1
                         7099
                     1
## 2
                     2 96587
## 3
                     3 595477
# At least 347 road workers died 2015-2018
# While small, that's not nothing given the population size.
UK_CasualtyData %>%
  count(Pedestrian_Road_Maintenance_Worker)
     Pedestrian_Road_Maintenance_Worker
                                              n
## 1
                                            434
## 2
                                       0 671681
## 3
                                       1
                                            347
## 4
                                       2 26701
```

UK_VehicleData Variable Analysis

The following represents a look at the counts for occurrences of variables in the UK_VehicleData dataset. Comments above each represent findings.

```
# UK_VehicleData

# Repeated from other analysis.
# Most vehicles in accidents are in a one or two care accident.
# As expected, some accidents involve more than two cars, but far fewer.
UK_VehicleData %>%
    count(Vehicle_Reference) %>%
    arrange(-n) %>%
    head(20)
```

```
##
      Vehicle_Reference
## 1
                        1 529172
## 2
                       2 373763
## 3
                       3 54768
## 4
                        4
                         12657
## 5
                       5
                           3274
## 6
                       6
                            1092
## 7
                       7
                             452
## 8
                       8
                             195
## 9
                       9
                             107
## 10
                      10
                              56
                              30
## 11
                      11
## 12
                      12
                              20
                      13
                              16
## 13
```

```
## 14
                     14
                             13
## 15
                     15
                             10
## 16
                              9
                     16
## 17
                     22
                              6
## 18
                     17
                              4
## 19
                     18
                              4
## 20
                     21
                              4
# Cars most, then vans and motorcycles.
UK_VehicleData %>%
count(Vehicle_Type)
```

```
##
      Vehicle_Type
                       n
## 1
               -1
                      968
## 2
                1 75566
## 3
                2
                    7638
                3 34624
## 4
## 5
                4
                    9035
                5 25696
## 6
## 7
                8 21210
## 8
                9 690344
## 9
                10
                    1818
## 10
               11 19890
## 11
               16
                     386
## 12
               17
                     2032
## 13
               18
                       81
## 14
               19 51542
## 15
                20
                    5457
## 16
                21 16721
## 17
               22
                     967
## 18
               23
                     174
## 19
               90
                     5985
## 20
                97
                     1346
## 21
                98
                     4200
```

```
# The vast majority of vehicles were simply driving straight ahead
# I've heard about "Road Hypnosis", I wonder if this is at play?
# I think a visualization will tell more of the story for the others.
UK_VehicleData %>%
count(Vehicle_Manoeuvre)
```

```
##
      Vehicle_Manoeuvre
## 1
                    -1 15550
## 2
                     1 13833
## 3
                     2 39615
## 4
                     3 58108
## 5
                     4 71680
## 6
                     5 44667
## 7
                     6
                        7735
## 8
                     7 32377
## 9
                     8
                        4656
## 10
                    9 93441
## 11
                    10 14243
```

```
## 12
                          8394
                     11
## 13
                        9030
                     12
## 14
                     13 18850
## 15
                     14 11203
## 16
                     15
                         6503
## 17
                     16 28891
## 18
                     17 33275
                     18 463629
## 19
# Most accidents did not involve getting towed.
UK_VehicleData %>%
count(Towing_and_Articulation)
     Towing_and_Articulation
## 1
                               9759
                           0 951029
## 2
## 3
                           1
                               9694
## 4
                           2
                               197
## 5
                               586
## 6
                               3216
## 7
                               1199
# Vast majority were on a Main road not in a restricted lane.
# Again, statistically, wouldn't this be expected?
UK_VehicleData %>%
count(Vehicle_Location_Restricted_Lane)
##
      Vehicle_Location_Restricted_Lane
## 1
                                    -1 15237
## 2
                                     0 935869
## 3
                                          427
## 4
                                     2
                                       4443
## 5
                                     3
                                         350
## 6
                                     4
                                       3458
## 7
                                       1242
## 8
                                     6
                                       2636
## 9
                                         535
## 10
                                     8
                                        1088
## 11
                                       10395
# A slight majority were not at an intersection
# The rest were doing some road change.
UK_VehicleData %>%
count(Junction_Location)
##
      Junction_Location
                             n
## 1
                     -1 11466
## 2
                      0 394357
## 3
                      1 216258
## 4
                      2 52839
## 5
                     3 14488
## 6
                     4 26125
```

```
## 7
                     5 24089
## 8
                     6 41257
## 9
                     7 3331
## 10
                     8 191470
# Most did not skid
UK_VehicleData %>%
count(Skidding_and_Overturning)
     Skidding_and_Overturning
## 1
                          -1 16530
## 2
                            0 858351
## 3
                            1 64699
## 4
                            2 16556
## 5
                            3
                                291
## 6
                            4
                                172
## 7
                            5 19081
# Most did not strike an object other than an in motion vehicle
# Of those that did strike an on-road object:
# 4 Parked Vehicle
# 10 Curb/Kerb
UK_VehicleData %>%
count(Hit_Object_in_Carriageway)
##
      Hit_Object_in_Carriageway
                                    n
## 1
                             -1 16643
## 2
                             0 916666
## 3
                                  427
## 4
                              2
                                  545
## 5
                              4 15349
## 6
                             5
                                 104
## 7
                                 558
                             6
## 8
                             7
                                4515
## 9
                                1688
## 10
                             9
                                1005
## 11
                            10 14290
## 12
                                 2812
                            11
## 13
                            12
                                 1078
# Most did not strike an object other than an in motion vehicle
# Of those that4 did strike an off-road object:
# 4 Tree
# 10 "Other" Permanent Object
# 11 Wall or Fence
UK_VehicleData %>%
count(Hit_Object_off_Carriageway)
##
      Hit_Object_off_Carriageway
## 1
                              -1 13838
## 2
                              0 897151
```

6309

3

```
## 5
                               3
                                  1997
## 6
                               4 10490
## 7
                               5
                                    442
## 8
                               6
                                  4791
## 9
                               7
                                   4849
## 10
                               8
                                     67
## 11
                               9
                                   5877
## 12
                              10 13326
## 13
                              11 11307
# The majority were not leaving the road,
# This aligns with the fact most were driving straigh ahead
# Oh those that did, the majority were
# Nearside (1)
# or Offside (7)
UK_VehicleData %>%
count(Vehicle_Leaving_Carriageway)
##
      Vehicle_Leaving_Carriageway
## 1
                               -1 15860
## 2
                                0 860391
## 3
                                1 52897
## 4
                                2
                                    6387
## 5
                                3
                                    3744
## 6
                                4
                                    3817
## 7
                                5
                                    2480
## 8
                                    802
                                6
## 9
                                7 26094
## 10
                                    3208
#Defining Unfamiliar Terms:
# - **Nearside**: This is the side of the vehicle closest to the curb or side of the road.
# In the UK, where driving is on the left-hand side of the road,
  the nearside would be the left side of the vehicle.
# - **Offside**: This is the side of the vehicle that is closest to the middle of the road.
     In the UK, this would be the right side of the vehicle.
# These terms are used to describe where a vehicle left the carriageway
# (i.e., the main part of the road). For example:
# - **"Nearside"**: The vehicle left the road and ended up on the side closest to the curb.
# - **"Offside"**: The vehicle left the road and ended up on the side closest to the middle of the road
# or possibly even crossed to the opposite side.
# Related to side, left-handed or not?
# Most were, in the UK where almost all cars were, no shockers here.
UK VehicleData %>%
count(Was_Vehicle_Left_Hand_Drive)
   Was_Vehicle_Left_Hand_Drive
                              -1 17808
## 1
```

2 5236

4

```
## 2
                                1 952022
## 3
                                   5850
# Most firs point of impact was front.
# This makes sense as there were a lot more vehicle one (529,172)
# than there were vehicle two (373,763) accidents.
# This means a significant amount were single car accidents striking something else.
UK VehicleData %>%
count(First_Point_of_Impact)
## First_Point_of_Impact
## 1
                        -1 10685
## 2
                         0 57071
## 3
                         1 478211
## 4
                         2 168582
## 5
                         3 137494
## 6
                         4 123637
# Reminder for sql in R:
#view(sqldf("sql here lower case"))
#variable_name <- sqldf("sql here lower case")</pre>
#view (variable_name)
# (Vehicle_Reference, First_Point_of_Impact, Hit_Object_in_Carriageway, Hit_Object_off_Carriageway) %>%
conn <- dbConnect(odbc(),</pre>
       Driver = "SQL Server",
        Server = "LAPTOP-76LHVPRQ\\SQLEXPRESS",
         Database = "UK_RoadSafety",
          Trusted_Connection = "True")
VehicleNum_vs_Impact <- sqldf(</pre>
  "select
  Vehicle_Reference,
  First Point of Impact,
 Hit_Object_in_Carriageway,
  Hit_Object_off_Carriageway,
  Vehicle_Manoeuvre,
  count(Accident_Index) as count_of_incidents
  from UK_VehicleData
  where Vehicle_Reference in ('1','2')
  and First_Point_of_Impact <> '-1'
  and Hit_Object_in_Carriageway <> '-1'
  and Hit_Object_off_Carriageway <> '-1'
  group by
  Vehicle_Reference,
  First_Point_of_Impact,
  Hit_Object_in_Carriageway,
  Hit_Object_off_Carriageway,
  Vehicle_Manoeuvre
  --having count(Accident_Index) = '1'
```

```
order by Vehicle_Reference, count_of_incidents DESC;")
# View SQL aggregates
# View(VehicleNum_vs_Impact)
summary(VehicleNum_vs_Impact)
   Vehicle_Reference First_Point_of_Impact Hit_Object_in_Carriageway
## Min.
          :1.000 Min.
                          :0.000
                                         Min.
                                                 : 0.000
## 1st Qu.:1.000
                     1st Qu.:1.000
                                          1st Qu.: 0.000
## Median :1.000
                     Median :2.000
                                         Median : 6.000
## Mean
         :1.396
                     Mean :2.133
                                          Mean : 5.099
## 3rd Qu.:2.000
                     3rd Qu.:3.000
                                          3rd Qu.:10.000
## Max.
                                                 :12.000
          :2.000
                     Max.
                           :4.000
                                          Max.
## Hit_Object_off_Carriageway Vehicle_Manoeuvre count_of_incidents
## Min.
         : 0.000
                                    :-1.00
                                               Min.
                                                            1.0
                             Min.
                                                     :
## 1st Qu.: 0.000
                             1st Qu.: 5.00
                                               1st Qu.:
                                                            1.0
## Median : 4.000
                             Median :12.00
                                               Median :
                                                            3.0
## Mean : 4.443
                             Mean :10.93
                                               Mean :
                                                          220.3
## 3rd Qu.: 9.000
                              3rd Qu.:16.00
                                               3rd Qu.:
                                                           11.0
## Max. :11.000
                             Max. :18.00
                                                      :134574.0
                                               Max.
head(VehicleNum_vs_Impact)
```

```
##
     Vehicle_Reference First_Point_of_Impact Hit_Object_in_Carriageway
## 1
                       1
                                              1
                                                                           0
## 2
                                                                           0
                       1
                                              1
## 3
                      1
                                              4
                                                                           0
                                              3
                                                                           0
## 4
                      1
## 5
                       1
                                              1
## 6
                       1
                                              1
##
     Hit_Object_off_Carriageway Vehicle_Manoeuvre count_of_incidents
## 1
                                0
                                                   18
                                                                   134574
## 2
                                0
                                                   9
                                                                    32382
## 3
                                0
                                                   18
                                                                    27445
## 4
                                0
                                                   18
                                                                    23147
## 5
                                0
                                                   5
                                                                    16417
## 6
                                0
                                                                    15256
```

Joined Tables

By joining the tables on the Primary Key correlations reference keys, we might be able to see some interesting overlaps or correlations.

```
# ESTABLISH CONNECTION TO MY LOCAL DATABASE

connection <- odbcDriverConnect("driver={SQL Server}; server=LAPTOP-76LHVPRQ\\SQLEXPRESS; database=UK_Road

# ASSIGN THE DATABASE TABLE AS A DATAFRAME (df) VARIABLE FOR EASIER RECALL
```

```
UK_AccidentData <- sqlFetch(connection, "dbo.uk_accidents")</pre>
#write.csv(UK_AccidentData, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Amplify_Intervie
UK_CasualtyData <- sqlFetch(connection, "dbo.uk_casualties")</pre>
#write.csv(UK_CasualtyData, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Amplify_Intervie
UK VehicleData <- sqlFetch(connection, "dbo.uk vehicles")</pre>
#write.csv(UK_VehicleData, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Amplify_Interview
All_Accident_Data <- sqldf(</pre>
                    "select *
                    from UK_AccidentData as a
                    join UK_VehicleData as v
                      on a.Accident_Index=v.Accident_Index
                    join UK_CasualtyData as c
                       on a.Accident_Index=c.Accident_Index
                       and v.Vehicle_Reference=c.Vehicle_Reference;")
# View(All_Accident_Data)
head(All_Accident_Data)
     Accident_Index Location_Easting_OSGR Location_Northing_OSGR Longitude
## 1 201501BS70055
                                    527920
                                                            179050 -0.158650
## 2 201501BS70056
                                    523110
                                                            181540 -0.227035
## 3 201501BS70057
                                    525540
                                                            179380 -0.192799
## 4 201501BS70058
                                    526940
                                                            177450 -0.173334
## 5 201501BS70060
                                    525230
                                                            180630 -0.196819
## 6 201501BS70061
                                    525520
                                                            179460 -0.193059
   Latitude Police_Force Accident_Severity Number_of_Vehicles
## 1 51.49593
                         1
## 2 51.51937
                         1
                                            3
                                                                2
## 3 51.49943
                                            3
                                                                2
## 4 51.48177
                                            3
                          1
                                                                1
## 5 51.51073
                                            3
                                                                2
## 6 51.50015
                                            3
                                                                2
                         1
    Number_of_Casualties Day_of_Week
                                                    Time Local_Authority_District
## 1
                        1
                                     1 23:05:00.0000000
## 2
                        1
                                     5 08:35:00.0000000
                                                                                11
## 3
                        1
                                     5 16:30:00.0000000
                                                                                12
## 4
                                     6 08:52:00.0000000
                                                                                12
                        1
## 5
                                     6 13:27:00.0000000
                         1
                                                                                12
## 6
                                     2 21:16:00.0000000
                                                                                12
                         1
     Local_Authority_Highway First_Road_Class First_Road_Number Road_Type
## 1
                   E09000020
                                             3
                                                             3216
## 2
                   E09000013
                                             4
                                                              412
                                                                           6
                                                                           6
## 3
                   E09000020
                                             5
                                                                0
## 4
                   E09000020
                                             3
                                                             3220
## 5
                   E09000020
                                             6
                                                                0
                                                                           6
## 6
                   E09000020
                                             5
    Speed_limit Junction_Detail Junction_Control Second_Road_Class
## 1
                                0
                                                -1
                                                                   -1
## 2
              30
                                0
                                                 -1
```

```
## 3
               30
                                                                       6
## 4
               30
                                 0
                                                  -1
                                                                      -1
                                 0
## 5
               30
                                                  -1
                                                                      -1
## 6
               30
                                 3
                                                   4
                                                                       6
     Second_Road_Number Pedestrian_Crossing_Human_Control
##
## 1
                       0
## 2
                       0
                                                            0
## 3
                       0
                                                            0
## 4
                       0
                                                            0
## 5
                       0
                                                            0
## 6
                       0
##
     Pedestrian_Crossing_Physical_Facilities Light_Conditions Weather_Conditions
## 1
                                              0
                                                                                     1
## 2
                                              0
                                                                                     2
## 3
                                              0
                                                                                     1
                                                                1
## 4
                                              5
                                                                                     1
## 5
                                              0
                                                                1
                                                                                     1
## 6
                                              0
                                                                                     1
##
     Road_Surface_Conditions Special_Conditions_at_Site Carriageway_Hazards
## 1
                             1
## 2
                             2
                                                          0
                                                                               0
## 3
                             1
                                                          0
                                                                               0
## 4
                                                          0
                                                                               0
                             1
## 5
                                                          0
                             1
                                                                               0
## 6
                                                          0
                             1
                                                                               0
     Urban_or_Rural_Area Did_Police_Officer_Attend_Scene_of_Accident
## 1
                        1
## 2
                                                                        1
                        1
## 3
                        1
                                                                        1
## 4
                        1
                                                                        1
## 5
                        1
## 6
                        1
     LSOA_of_Accident_Location
                                       Date
                                                   TimeGroup Accident_Index
                                                  Late_Night 201501BS70055
## 1
                      E01002863 2015-08-02
## 2
                      E01001874 2015-05-02 Morning_Commute 201501BS70056
## 3
                      E01002816 2015-05-02
                                                   Afternoon 201501BS70057
## 4
                      E01002840 2015-06-02 Morning Commute 201501BS70058
## 5
                      E01002884 2015-06-02
                                                   Afternoon 201501BS70060
## 6
                      E01002816 2015-09-02
                                                  Late_Night 201501BS70061
     Vehicle_Reference Vehicle_Type Towing_and_Articulation Vehicle_Manoeuvre
## 1
                                    9
                      1
                                                              0
## 2
                      2
                                    1
                                                              0
                                                                                 18
## 3
                      2
                                    3
                                                              0
                                                                                 7
## 4
                                                              0
                                                                                  4
                      1
                                   11
## 5
                      2
                                                              0
                                                                                18
                                    1
                                                              0
## 6
                      1
                                    1
                                                                                 18
     Vehicle_Location_Restricted_Lane Junction_Location Skidding_and_Overturning
## 1
                                      0
                                                          0
                                                                                     0
                                      0
## 2
                                                          0
                                                                                     0
## 3
                                      0
                                                          8
                                                                                     0
## 4
                                       0
                                                          0
                                                                                     0
## 5
                                      0
                                                          0
                                                                                     0
## 6
                                      0
                                                                                     0
     Hit_Object_in_Carriageway Vehicle_Leaving_Carriageway
```

```
## 1
                              0
                                                            0
## 2
                              0
                                                            0
## 3
                              0
                                                            0
## 4
                              0
                                                            0
## 5
                              8
                                                            0
## 6
                              0
                                                            0
     Hit_Object_off_Carriageway First_Point_of_Impact Was_Vehicle_Left_Hand_Drive
                               0
## 1
                                                       1
## 2
                                                                                    1
## 3
                                                       0
                                                                                    1
## 4
## 5
                               0
## 6
                               0
                                                      1
     Journey_Purpose_of_Driver Sex_of_Driver Age_of_Driver Age_Band_of_Driver
## 1
                              6
                                             2
                                                           20
## 2
                                                                                7
                              6
                                             1
                                                           42
## 3
                              6
                                             1
                                                           29
                                                                                6
                                                           63
                                                                                9
## 4
## 5
                              6
                                             1
                                                           25
                                                                                5
## 6
                              6
                                             1
                                                           56
                                                                                9
##
     Engine_Capacity_CC Propulsion_Code Age_of_Vehicle Driver_IMD_Decile
                    3498
                                      1
## 2
                      -1
                                                       -1
                                                                          -1
                                       -1
## 3
                      -1
                                       -1
                                                       -1
                                                                          -1
                    4500
                                        2
## 4
                                                       1
                                                                          -1
                      -1
                                       -1
                                                       -1
                                                                          -1
                     -1
                                       -1
                                                                          -1
## 6
                                                      -1
     Driver_Home_Area_Type Vehicle_IMD_Decile Accident_Index Vehicle_Reference
## 1
                                             -1 201501BS70055
                          1
## 2
                          1
                                             -1 201501BS70056
                                                                                 2
                                                                                 2
## 3
                          1
                                             -1 201501BS70057
## 4
                          1
                                             -1 201501BS70058
## 5
                                             -1 201501BS70060
## 6
                          1
                                             -1 201501BS70061
##
     Casualty_Reference Casualty_Class Sex_of_Casualty Age_of_Casualty
## 1
                                      2
                                                        2
                       1
                                                                        20
## 2
                                       1
                                                                        42
## 3
                       1
                                       1
                                                        1
                                                                        29
## 4
                                                                        26
## 5
                                                                       25
                       1
## 6
                      1
                                      1
##
     Age_Band_of_Casualty Casualty_Severity Pedestrian_Location
## 1
                         4
                                            3
## 2
                         7
                                            3
                                                                 0
## 3
                                            3
                                                                 0
## 4
## 5
## 6
                         9
                                            3
     Pedestrian_Movement Car_Passenger Bus_or_Coach_Passenger
## 1
                        0
                                       1
## 2
                                       0
                        0
                                                               0
## 3
                                       0
                        0
                                                               0
## 4
                        0
                                       0
                                                               3
## 5
                        0
                                                               0
```

```
## 6
                         0
                                                                   0
     Pedestrian_Road_Maintenance_Worker Casualty_Type Casualty_Home_Area_Type
## 1
                                          0
                                                          9
## 2
                                          0
                                                          1
                                                                                     1
## 3
                                          0
                                                          3
                                                                                     1
## 4
                                          0
                                                         11
                                                                                     1
## 5
                                          0
                                                          1
                                                                                     1
## 6
                                          0
                                                          1
                                                                                     1
     Casualty_IMD_Decile
## 1
                        -1
## 2
                         3
## 3
                         6
                         8
## 4
                         3
## 5
## 6
                         5
```

summary(All_Accident_Data)

```
Accident Index
                      Location Easting OSGR Location Northing OSGR
## Length:699163
                      Min. : 70860
                                           Min. : 10235
                                            1st Qu.: 176620
   Class : character
                      1st Qu.:384909
##
  Mode :character
                      Median :451891
                                            Median: 241761
##
                      Mean
                             :447498
                                            Mean
                                                 : 288741
##
                      3rd Qu.:527257
                                            3rd Qu.: 391268
##
                      Max.
                             :655391
                                            Max.
                                                  :1209512
##
                      NA's
                                            NA's
                             :149
                                                  :149
##
     Longitude
                        Latitude
                                      Police_Force
                                                    Accident_Severity
##
   Min.
          :-7.4229
                     Min.
                            :49.91
                                     Min.
                                            : 1.00
                                                    Min. :1.000
##
   1st Qu.:-2.2264
                     1st Qu.:51.47
                                     1st Qu.: 6.00
                                                    1st Qu.:3.000
   Median :-1.2317
                     Median :52.06
                                     Median :30.00
                                                    Median :3.000
##
  Mean
         :-1.3214
                     Mean
                           :52.49
                                     Mean
                                           :29.61
                                                           :2.793
                                                    Mean
##
   3rd Qu.:-0.1654
                     3rd Qu.:53.42
                                     3rd Qu.:45.00
                                                    3rd Qu.:3.000
## Max.
         : 1.7596
                     Max.
                          :60.76
                                     Max.
                                           :98.00
                                                    Max.
                                                           :3.000
  NA's
          :163
                     NA's
                            :163
##
  Number_of_Vehicles Number_of_Casualties Day_of_Week
                                                              Time
## Min. : 1.000
                      Min. : 1.000
                                          Min. :1.000
                                                          Length: 699163
##
  1st Qu.: 1.000
                      1st Qu.: 1.000
                                           1st Qu.:2.000
                                                          Class : character
  Median : 2.000
                      Median : 1.000
                                          Median :4.000
                                                          Mode : character
  Mean : 1.945
                           : 1.781
                                          Mean :4.102
##
                      Mean
   3rd Qu.: 2.000
##
                      3rd Qu.: 2.000
                                           3rd Qu.:6.000
##
  Max. :37.000
                      Max.
                             :59.000
                                          Max. :7.000
##
##
   Local_Authority_District Local_Authority_Highway First_Road_Class
##
   Min. : 1.0
                            Length:699163
                                                   Min. :1.000
##
   1st Qu.:104.0
                            Class : character
                                                   1st Qu.:3.000
## Median:321.0
                                                   Median :3.000
                            Mode :character
##
   Mean :341.3
                                                    Mean
                                                         :4.094
##
   3rd Qu.:516.0
                                                    3rd Qu.:6.000
##
  Max. :941.0
                                                   Max.
                                                          :6.000
##
## First Road Number
                                      Speed limit
                                                      Junction Detail
                       Road_Type
## Min. :
                                      Min. : 0.00
              0.0
                     Min. :-1.000
                                                     Min.
                                                            :-1.000
              0.0
                     1st Qu.: 6.000
                                      1st Qu.:30.00
                                                     1st Qu.: 0.000
  1st Qu.:
## Median: 62.0
                     Median : 6.000
                                     Median :30.00
                                                     Median : 1.000
```

```
Mean
         : 906.4
                     Mean : 5.156
                                     Mean
                                            :38.97
                                                     Mean
                                                           : 2.238
##
   3rd Qu.: 633.0
                     3rd Qu.: 6.000
                                     3rd Qu.:50.00
                                                     3rd Qu.: 3.000
   Max. :9918.0
##
                     Max. : 9.000
                                     Max.
                                            :70.00
                                                     Max. : 9.000
                                            :47
##
                                     NA's
##
   Junction Control Second Road Class Second Road Number
                                            : -1.0
##
  Min.
         :-1.000
                    Min.
                          :-1.000
                                     Min.
   1st Qu.:-1.000
                    1st Qu.:-1.000
                                     1st Qu.:
                                                0.0
## Median : 2.000
                    Median : 3.000
                                     Median :
                                                0.0
   Mean : 1.608
                    Mean : 2.576
                                     Mean : 319.8
##
   3rd Qu.: 4.000
                    3rd Qu.: 6.000
                                     3rd Qu.:
                                                0.0
  Max. : 4.000
                    Max. : 6.000
                                     Max.
                                            :9999.0
##
## Pedestrian_Crossing_Human_Control Pedestrian_Crossing_Physical_Facilities
## Min.
          :-1.000000
                                           :-1.0000
                                    Min.
  1st Qu.: 0.000000
                                    1st Qu.: 0.0000
## Median: 0.000000
                                    Median : 0.0000
##
  Mean : 0.005251
                                    Mean : 0.8015
   3rd Qu.: 0.000000
                                    3rd Qu.: 0.0000
##
  Max. : 2.000000
                                    Max. : 8.0000
##
##
  Light_Conditions Weather_Conditions Road_Surface_Conditions
         :-1.000
                    Min. :-1.00
                                      Min.
                                            :-1.000
  1st Qu.: 1.000
                    1st Qu.: 1.00
                                      1st Qu.: 1.000
##
## Median : 1.000
                    Median: 1.00
                                      Median: 1.000
## Mean : 2.019
                    Mean : 1.56
                                      Mean : 1.295
                    3rd Qu.: 1.00
   3rd Qu.: 4.000
                                      3rd Qu.: 2.000
## Max. : 7.000
                    Max. : 9.00
                                      Max. : 5.000
## Special_Conditions_at_Site Carriageway_Hazards Urban_or_Rural_Area
         :-1.00000
                                    :-1.00000
## Min.
                             Min.
                                                 Min.
                                                      :-1.000
## 1st Qu.: 0.00000
                                                 1st Qu.: 1.000
                             1st Qu.: 0.00000
  Median : 0.00000
                             Median : 0.00000
                                                 Median : 1.000
  Mean : 0.08974
                             Mean : 0.05498
                                                 Mean : 1.374
##
   3rd Qu.: 0.00000
                             3rd Qu.: 0.00000
                                                 3rd Qu.: 2.000
##
   Max. : 7.00000
                             Max. : 7.00000
                                                 Max. : 3.000
##
  Did Police Officer Attend Scene of Accident LSOA of Accident Location
## Min.
         :-1.000
                                              Length:699163
   1st Qu.: 1.000
##
                                              Class : character
## Median : 1.000
                                              Mode :character
## Mean : 1.225
##
  3rd Qu.: 1.000
  Max. : 3.000
##
##
##
       Date
                       TimeGroup
                                        Accident_Index
                                                           Vehicle_Reference
                                                          Min. : 1.000
##
   Length: 699163
                      Length:699163
                                        Length:699163
                                                           1st Qu.: 1.000
   Class : character
                      Class :character
                                        Class :character
##
   Mode :character
                      Mode :character
                                        Mode :character
                                                           Median: 1.000
##
                                                           Mean : 1.488
##
                                                           3rd Qu.:
                                                                    2.000
##
                                                           Max.
                                                                :999.000
##
##
    Vehicle_Type
                    Towing_and_Articulation Vehicle_Manoeuvre
                   Min. :-1.000000
                                           Min. :-1.00
##
   Min. :-1.000
```

```
## 1st Qu.: 9.000
                   1st Qu.: 0.000000
                                          1st Qu.: 9.00
## Median: 9.000
                   Median : 0.000000
                                          Median :18.00
## Mean : 8.714
                   Mean : 0.006878
                                          Mean :13.37
## 3rd Qu.: 9.000
                   3rd Qu.: 0.000000
                                          3rd Qu.:18.00
##
  Max. :98.000
                   Max. : 5.000000
                                          Max. :18.00
##
  Vehicle Location Restricted Lane Junction Location Skidding and Overturning
## Min. :-1.0000
                                  Min. :-1.000
                                                   Min. :-1.000
  1st Qu.: 0.0000
                                  1st Qu.: 0.000
                                                   1st Qu.: 0.000
##
  Median : 0.0000
                                  Median : 1.000
                                                   Median : 0.000
  Mean : 0.1509
                                  Mean : 2.364
                                                   Mean : 0.294
   3rd Qu.: 0.0000
                                  3rd Qu.: 5.000
                                                   3rd Qu.: 0.000
##
  Max. : 9.0000
                                  Max. : 8.000
                                                   Max. : 5.000
##
## Hit_Object_in_Carriageway Vehicle_Leaving_Carriageway
                            Min. :-1.0000
## Min. :-1.0000
##
  1st Qu.: 0.0000
                            1st Qu.: 0.0000
  Median : 0.0000
                           Median : 0.0000
##
## Mean : 0.4397
                           Mean : 0.5006
   3rd Qu.: 0.0000
                            3rd Qu.: 0.0000
##
##
  Max. :12.0000
                           Max. : 8.0000
##
## Hit_Object_off_Carriageway First_Point_of_Impact Was_Vehicle_Left_Hand_Drive
## Min. :-1.0000
                            Min. :-1.000
                                                 Min. :-1.0000
                                                 1st Qu.: 1.0000
##
  1st Qu.: 0.0000
                            1st Qu.: 1.000
  Median : 0.0000
                            Median : 1.000
                                                 Median: 1.0000
## Mean : 0.7287
                             Mean : 1.776
                                                 Mean : 0.9775
   3rd Qu.: 0.0000
                             3rd Qu.: 3.000
                                                 3rd Qu.: 1.0000
##
  Max. :11.0000
                             Max. : 4.000
                                                 Max. : 2.0000
##
   Journey_Purpose_of_Driver Sex_of_Driver
                                            Age_of_Driver
                                                            Age_Band_of_Driver
        :-1.000
## Min.
                           Min. :-1.000
                                            Min. : -1.00
                                                            Min. :-1.000
##
  1st Qu.: 3.000
                            1st Qu.: 1.000
                                            1st Qu.: 25.00
                                                            1st Qu.: 5.000
## Median : 6.000
                           Median : 1.000
                                            Median : 36.00
                                                            Median : 7.000
                            Mean : 1.362
                                                            Mean : 6.468
## Mean : 4.738
                                            Mean : 37.88
   3rd Qu.: 6.000
                            3rd Qu.: 2.000
##
                                            3rd Qu.: 50.00
                                                            3rd Qu.: 8.000
## Max. : 6.000
                           Max. : 3.000
                                            Max. :101.00
                                                            Max. :11.000
##
                                                       Driver IMD Decile
   Engine Capacity CC Propulsion Code
                                      Age_of_Vehicle
                 Min. :-1.0000
                                                       Min. :-1.000
##
  Min. : -1
                                     Min. : -1.000
  1st Qu.: 124
                     1st Qu.: 1.0000
                                      1st Qu.: -1.000
                                                       1st Qu.:-1.000
                                                       Median : 2.000
                     Median : 1.0000
                                     Median : 5.000
## Median : 1360
   Mean : 1323
                     Mean : 0.9135
                                      Mean : 5.755
                                                       Mean : 2.434
##
   3rd Qu.: 1797
                     3rd Qu.: 2.0000
                                      3rd Qu.: 10.000
                                                       3rd Qu.: 5.000
  Max. :91000
                     Max. :12.0000
                                      Max. :105.000
                                                       Max. :10.000
##
  Driver_Home_Area_Type Vehicle_IMD_Decile Accident_Index
                                                            Vehicle Reference
## Min. :-1.0000
                        Min. :-1.000
                                          Length: 699163
                                                            Min. : 1.000
  1st Qu.: 1.0000
                        1st Qu.:-1.000
                                          Class :character
                                                            1st Qu.: 1.000
## Median : 1.0000
                        Median : 2.000
                                          Mode :character
                                                            Median : 1.000
## Mean : 0.9852
                        Mean : 2.434
                                                            Mean : 1.488
## 3rd Qu.: 1.0000
                        3rd Qu.: 5.000
                                                            3rd Qu.: 2.000
## Max. : 3.0000
                        Max. :10.000
                                                            Max.
                                                                  :999.000
##
```

```
## Casualty_Reference Casualty_Class Sex_of_Casualty Age_of_Casualty
## Min.
         : 1.000
                      Min.
                             :1.00
                                    Min. :-1.000
                                                     Min. : -1.00
## 1st Qu.: 1.000
                      1st Qu.:1.00
                                    1st Qu.: 1.000
                                                      1st Qu.: 22.00
## Median : 1.000
                      Median :1.00
                                   Median : 1.000
                                                     Median : 33.00
         : 1.406
   Mean
                      Mean
                             :1.49
                                    Mean : 1.406
                                                     Mean
                                                            : 36.48
##
   3rd Qu.: 2.000
                      3rd Qu.:2.00
                                     3rd Qu.: 2.000
                                                      3rd Qu.: 50.00
                                                     Max.
  Max. :991.000
                      Max.
                             :3.00
                                    Max. : 2.000
                                                            :104.00
##
   Age_Band_of_Casualty_Casualty_Severity Pedestrian_Location Pedestrian_Movement
##
  Min.
         :-1.000
                        Min. :1.000
                                          Min. :-1.000
                                                             Min.
                                                                    :-1.0000
  1st Qu.: 5.000
                        1st Qu.:3.000
                                          1st Qu.: 0.000
                                                             1st Qu.: 0.0000
## Median : 6.000
                        Median :3.000
                                          Median : 0.000
                                                             Median : 0.0000
## Mean
         : 6.289
                        Mean
                              :2.842
                                          Mean
                                               : 0.714
                                                             Mean
                                                                    : 0.5418
##
   3rd Qu.: 8.000
                        3rd Qu.:3.000
                                          3rd Qu.: 0.000
                                                             3rd Qu.: 0.0000
## Max.
         :11.000
                        Max.
                               :3.000
                                          Max.
                                                :10.000
                                                             Max.
                                                                    : 9.0000
##
##
  Car_Passenger
                     Bus_or_Coach_Passenger Pedestrian_Road_Maintenance_Worker
## Min. :-1.0000
                     Min. :-1.00000
                                           Min. :-1.00000
## 1st Qu.: 0.0000
                     1st Qu.: 0.00000
                                            1st Qu.: 0.00000
## Median : 0.0000
                     Median : 0.00000
                                            Median : 0.00000
## Mean : 0.2523
                     Mean : 0.07744
                                            Mean : 0.07626
   3rd Qu.: 0.0000
                     3rd Qu.: 0.00000
                                            3rd Qu.: 0.00000
## Max. : 2.0000
                    Max. : 4.00000
                                                  : 2.00000
                                            Max.
##
                    Casualty_Home_Area_Type Casualty_IMD_Decile
## Casualty_Type
## Min. :-1.000
                    Min.
                          :-1.000
                                            Min. :-1.000
## 1st Qu.: 3.000
                    1st Qu.: 1.000
                                            1st Qu.: 1.000
## Median: 9.000
                    Median : 1.000
                                            Median : 4.000
                                            Mean
## Mean
         : 7.281
                         : 0.986
                                                 : 3.714
                    Mean
## 3rd Qu.: 9.000
                    3rd Qu.: 1.000
                                            3rd Qu.: 7.000
## Max.
         :98.000
                    Max. : 3.000
                                            Max.
                                                  :10.000
##
#write.csv(All Accident Data, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Amplify Interv
Accidents_Vehicles_Casualties <- sqldf(</pre>
 "-- How many accidents had how many vehicles and casualties?
 select
 count(a.Accident Index) AS Count Incidents,
 v. Vehicle Reference,
 c.Casualty_Reference
 from UK_AccidentData as a
 join UK_VehicleData as v
   on a.Accident_Index=v.Accident_Index
 join UK_CasualtyData as c
   on a.Accident_Index=c.Accident_Index
   and v.Vehicle_Reference=c.Vehicle_Reference
 group by
 v. Vehicle_Reference,
 c.Casualty Reference
```

```
order by
 v. Vehicle_Reference,
 c.Casualty Reference")
# View(All_Accident_Data)
head(Accidents_Vehicles_Casualties)
    Count_Incidents Vehicle_Reference Casualty_Reference
## 1
             329081
                                    1
## 2
                                                      2
              41015
                                    1
## 3
              14104
                                    1
                                                      3
## 4
               4901
                                    1
                                                      4
                                                      5
## 5
               1663
                                    1
## 6
                568
summary(Accidents_Vehicles_Casualties)
## Count_Incidents
                      Vehicle_Reference Casualty_Reference
## Min. : 1.0 Min. : 1.000 Min. : 1.00
## 1st Qu.:
              1.0 1st Qu.: 2.000 1st Qu.: 5.00
              2.5 Median: 3.000 Median: 13.00
## Median :
## Mean : 2515.0 Mean : 9.932 Mean : 22.28
## 3rd Qu.: 13.8 3rd Qu.: 8.000 3rd Qu.: 29.00
## Max. :329081.0 Max. :999.000 Max. :991.00
#write.csv(Accidents_Vehicles_Casualties, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Am
Accidents_Light_Weather <- sqldf(</pre>
 "-- How many accidents had how many vehicles and casualties?
select
 count(a.Accident Index) AS Count Incidents,
 a.Light_Conditions,
 a.Weather_Conditions,
 a.Road_Surface_Conditions,
 v. Vehicle_Reference,
 c.Casualty_Reference
 from UK_AccidentData as a
 join UK_VehicleData as v
   on a.Accident_Index=v.Accident_Index
 join UK_CasualtyData as c
   on a.Accident_Index=c.Accident_Index
   and v.Vehicle_Reference=c.Vehicle_Reference
 where a.Light_Conditions <> '-1'
 and a.Weather_Conditions <> '-1'
 and a.Road_Surface_Conditions <> '-1'
 group by
```

```
a.Light_Conditions,
 a.Weather_Conditions,
 a.Road_Surface_Conditions,
 v.Vehicle_Reference,
 c.Casualty_Reference
 order by
 v. Vehicle_Reference,
 c.Casualty_Reference")
# View(All_Accident_Data)
head(Accidents_Light_Weather)
    Count_Incidents Light_Conditions Weather_Conditions Road_Surface_Conditions
## 1
             170261
                                  1
## 2
              20631
                                  1
                                                     1
                                                                            2
## 3
                                  1
                                                     1
                                                                            3
                131
                                                                            4
## 4
               2040
                                  1
                                                     1
                                                                            5
## 5
                 34
                                  1
                                                     1
## 6
                325
                                  1
                                                     2
                                                                            1
    Vehicle_Reference Casualty_Reference
## 1
                    1
                                      1
## 2
                    1
                                      1
## 3
                    1
                                      1
## 4
                    1
                                      1
## 5
                    1
                                      1
## 6
summary(Accidents_Light_Weather)
## Count_Incidents
                      Light_Conditions Weather_Conditions Road_Surface_Conditions
## Min. : 1.0 Min. :1.000
                                      Min. :1.000
                                                    Min. :1.000
## 1st Qu.:
               1.0 1st Qu.:1.000
                                      1st Qu.:1.000
                                                        1st Qu.:1.000
## Median :
                3.0 Median: 4.000
                                      Median :3.000
                                                       Median :2.000
## Mean :
              262.6 Mean :3.605
                                      Mean :3.935
                                                        Mean :2.222
## 3rd Qu.:
              12.0 3rd Qu.:6.000
                                      3rd Qu.:7.000
                                                        3rd Qu.:3.000
         :170261.0 Max. :7.000
                                           :9.000
## Max.
                                      Max.
                                                        Max. :5.000
## Vehicle_Reference Casualty_Reference
## Min. : 1.000
                    Min. : 1.00
                     1st Qu.: 2.00
## 1st Qu.: 1.000
## Median : 2.000
                     Median: 3.00
## Mean : 3.295
                     Mean : 5.94
## 3rd Qu.: 3.000
                     3rd Qu.: 5.00
## Max. :999.000
                     Max. :991.00
#write.csv(Accidents_Light_Weather, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Amplify_
All_Accident_Data <- sqldf(
                   "select *
                   from UK_AccidentData as a
                   join UK_VehicleData as v
```

```
Accident_Index Location_Easting_OSGR Location_Northing_OSGR Longitude
## 1 201501BS70055
                                    527920
                                                             179050 -0.158650
## 2 201501BS70056
                                     523110
                                                             181540 -0.227035
## 3 201501BS70057
                                     525540
                                                             179380 -0.192799
## 4 201501BS70058
                                     526940
                                                             177450 -0.173334
## 5 201501BS70060
                                     525230
                                                             180630 -0.196819
## 6 201501BS70061
                                    525520
                                                             179460 -0.193059
    Latitude Police_Force Accident_Severity Number_of_Vehicles
## 1 51.49593
                          1
                                             3
## 2 51.51937
                          1
                                             3
                                                                 2
                                                                 2
## 3 51.49943
                                             3
                          1
                                             3
## 4 51.48177
                          1
                                                                 1
                                                                 2
## 5 51.51073
                                             3
## 6 51.50015
                                             3
                                                                 2
                          1
     Number_of_Casualties Day_of_Week
                                                    Time Local_Authority_District
## 1
                                      1 23:05:00.0000000
                         1
                                                                                 12
## 2
                         1
                                      5 08:35:00.0000000
                                                                                 11
## 3
                                      5 16:30:00.0000000
                                                                                 12
                         1
## 4
                                      6 08:52:00.0000000
                                                                                 12
## 5
                                      6 13:27:00.0000000
                         1
                                                                                 12
                                      2 21:16:00.0000000
                         1
##
     Local_Authority_Highway First_Road_Class First_Road_Number Road_Type
## 1
                   E09000020
                                              3
                                                              3216
## 2
                    E09000013
                                              4
                                                               412
                                                                            6
                                                                            6
## 3
                   E09000020
                                              5
                                                                 0
                                              3
                                                              3220
                                                                            6
## 4
                    E09000020
                                              6
## 5
                    E09000020
                                                                            6
                                              5
## 6
                    E09000020
     Speed_limit Junction_Detail Junction_Control Second_Road_Class
## 1
              30
                                0
                                                 -1
## 2
              30
                                0
                                                 -1
                                                                     -1
                                3
## 3
              30
                                                  4
                                                                     6
              30
                                0
                                                                    -1
## 4
                                                 -1
## 5
              30
                                0
                                                  -1
                                                                     -1
## 6
              30
                                3
                                                                     6
     Second_Road_Number Pedestrian_Crossing_Human_Control
## 1
                       0
## 2
                       0
                                                           0
                       0
                                                           0
## 3
## 4
                       0
                                                           0
## 5
                       0
                                                           0
## 6
     Pedestrian Crossing Physical Facilities Light Conditions Weather Conditions
## 1
                                                                                   1
## 2
                                             0
                                                               1
                                                                                   2
```

```
## 3
                                              0
                                                                1
                                                                                     1
                                              5
## 4
                                                                1
                                                                                     1
                                              0
## 5
                                                                                     1
## 6
                                              0
                                                                                     1
##
     Road_Surface_Conditions Special_Conditions_at_Site Carriageway_Hazards
## 1
                                                          0
                             1
## 2
                             2
                                                          0
                                                                               0
## 3
                                                          0
                             1
                                                                               0
## 4
                             1
                                                          0
                                                                               0
## 5
                                                          0
                             1
                                                                               0
## 6
                             1
##
     Urban_or_Rural_Area Did_Police_Officer_Attend_Scene_of_Accident
## 1
                        1
## 2
                        1
                                                                        1
## 3
                                                                        1
                        1
## 4
                                                                        1
## 5
                        1
## 6
                        1
                                                                        1
##
     LSOA_of_Accident_Location
                                                   TimeGroup Accident_Index
                                       Date
## 1
                      E01002863 2015-08-02
                                                  Late Night 201501BS70055
## 2
                      E01001874 2015-05-02 Morning_Commute 201501BS70056
## 3
                      E01002816 2015-05-02
                                                   Afternoon 201501BS70057
## 4
                      E01002840 2015-06-02 Morning_Commute 201501BS70058
## 5
                      E01002884 2015-06-02
                                                   Afternoon 201501BS70060
## 6
                      E01002816 2015-09-02
                                                  Late_Night 201501BS70061
     Vehicle_Reference Vehicle_Type Towing_and_Articulation Vehicle_Manoeuvre
## 1
                                    9
                      1
                                                                                18
## 2
                      2
                                    1
                                                              0
                                                                                18
## 3
                      2
                                    3
                                                              0
                                                                                 7
                                                                                 4
## 4
                      1
                                   11
                                                              0
## 5
                      2
                                    1
                                                              0
                                                                                 18
## 6
                      1
                                    1
                                                              0
                                                                                 18
     Vehicle_Location_Restricted_Lane Junction_Location Skidding_and_Overturning
## 1
                                      0
                                                                                     0
                                                          0
## 2
                                      0
                                                          0
                                                                                     0
## 3
                                      0
                                                          8
                                                                                     0
## 4
                                      0
                                                          0
                                                                                     0
## 5
                                      0
                                                          0
                                                                                     0
## 6
                                      0
                                                                                     0
     Hit_Object_in_Carriageway Vehicle_Leaving_Carriageway
                               0
## 2
                               0
                                                             0
## 3
                               0
                                                             0
## 4
                               0
                                                             0
## 5
                               8
                                                             0
                               0
## 6
     Hit_Object_off_Carriageway First_Point_of_Impact Was_Vehicle_Left_Hand_Drive
##
## 1
                                0
                                0
## 2
                                                       3
                                                                                      1
## 3
                                0
                                                       0
                                                                                      1
                                0
## 4
                                                       0
                                                                                      1
                                0
## 5
                                                       1
                                                                                      1
## 6
                                0
     Journey_Purpose_of_Driver Sex_of_Driver Age_of_Driver Age_Band_of_Driver
```

```
## 1
                              6
                                                          20
## 2
                              6
                                             1
                                                          42
                                                                               7
## 3
                              6
                                                          29
                                                                               6
## 4
                              1
                                                          63
                                                                               9
## 5
                              6
                                                          25
                                                                               5
## 6
                              6
                                             1
                                                          56
                                                                               9
     Engine_Capacity_CC Propulsion_Code Age_of_Vehicle Driver_IMD_Decile
                   3498
## 1
                                      1
                                                      1
## 2
                      -1
                                      -1
                                                      -1
                                                                         -1
## 3
                     -1
                                      -1
                                                      -1
                                                                         -1
                                       2
                    4500
                                                      1
                                                                         -1
## 5
                                      -1
                                                                         -1
                     -1
                                                      -1
## 6
                      -1
                                      -1
                                                      -1
                                                                         -1
     Driver_Home_Area_Type Vehicle_IMD_Decile Accident_Index Vehicle_Reference
## 1
                          1
                                             -1 201501BS70055
## 2
                                             -1 201501BS70056
                                                                                2
                          1
## 3
                          1
                                             -1 201501BS70057
                                                                                2
## 4
                                             -1 201501BS70058
## 5
                          1
                                             -1 201501BS70060
                          1
                                             -1 201501BS70061
## 6
##
    Casualty_Reference Casualty_Class Sex_of_Casualty Age_of_Casualty
                                      2
## 2
                                                                       42
                                      1
                                                       1
                       1
## 3
                                                                       29
## 4
                                                                       26
                      1
                                                                       25
## 6
                      1
                                      1
                                                       1
                                                                       56
## Age_Band_of_Casualty_Severity Pedestrian_Location
## 1
                         4
                                           3
## 2
                                           3
                                                                 0
## 3
                                                                 0
                         6
                                           3
## 4
                                           3
## 5
                                           3
## 6
                         9
                                           3
     Pedestrian_Movement Car_Passenger Bus_or_Coach_Passenger
## 1
                        0
                                      1
## 2
                                      0
                        0
                                                              0
## 3
                        0
                                      0
                                                              0
## 4
                        0
                                                               3
## 5
                        0
## 6
                        0
     Pedestrian_Road_Maintenance_Worker Casualty_Type Casualty_Home_Area_Type
## 1
                                       0
                                                      9
## 2
                                       0
                                                      1
                                                                               1
## 3
                                       0
                                                      3
                                                                               1
## 4
                                       0
                                                     11
                                                                               1
## 5
                                       0
                                                      1
                                                                               1
## 6
                                       0
                                                      1
                                                                               1
     Casualty_IMD_Decile
## 1
## 2
                        3
## 3
                        6
## 4
                        8
## 5
                        3
```

6 5

summary(All_Accident_Data)

```
Accident_Index
                       Location_Easting_OSGR Location_Northing_OSGR
##
    Length:699163
                       Min.
                               : 70860
                                              Min.
                                                     : 10235
    Class : character
                       1st Qu.:384909
                                              1st Qu.: 176620
    Mode :character
                       Median: 451891
                                              Median: 241761
##
                       Mean
                               :447498
                                              Mean
                                                     : 288741
##
                       3rd Qu.:527257
                                              3rd Qu.: 391268
##
                       Max.
                               :655391
                                              Max.
                                                     :1209512
##
                       NA's
                                              NA's
                               :149
                                                     :149
##
      Longitude
                         Latitude
                                        Police Force
                                                        Accident_Severity
##
    Min.
           :-7.4229
                      Min.
                              :49.91
                                       Min.
                                              : 1.00
                                                       Min.
                                                               :1.000
    1st Qu.:-2.2264
                      1st Qu.:51.47
                                       1st Qu.: 6.00
                                                       1st Qu.:3.000
    Median :-1.2317
                      Median :52.06
                                       Median :30.00
                                                       Median :3.000
##
    Mean
          :-1.3214
                      Mean
                              :52.49
                                       Mean
                                              :29.61
                                                       Mean
                                                               :2.793
##
    3rd Qu.:-0.1654
                      3rd Qu.:53.42
                                       3rd Qu.:45.00
                                                       3rd Qu.:3.000
   Max.
                              :60.76
           : 1.7596
                      Max.
                                       Max.
                                              :98.00
                                                       Max.
                                                               :3.000
##
   NA's
           :163
                      NA's
                              :163
    Number_of_Vehicles Number_of_Casualties Day_of_Week
##
                                                                  Time
##
   Min. : 1.000
                       Min. : 1.000
                                             Min. :1.000
                                                              Length: 699163
    1st Qu.: 1.000
                       1st Qu.: 1.000
                                             1st Qu.:2.000
                                                              Class :character
                       Median : 1.000
##
    Median : 2.000
                                             Median :4.000
                                                              Mode :character
##
    Mean
          : 1.945
                       Mean
                               : 1.781
                                             Mean
                                                    :4.102
##
    3rd Qu.: 2.000
                       3rd Qu.: 2.000
                                             3rd Qu.:6.000
##
    Max.
           :37.000
                       Max.
                               :59.000
                                             Max.
                                                    :7.000
##
##
    Local_Authority_District Local_Authority_Highway First_Road_Class
   Min. : 1.0
                             Length:699163
                                                              :1.000
##
    1st Qu.:104.0
                              Class : character
                                                       1st Qu.:3.000
##
    Median :321.0
                             Mode :character
                                                       Median :3.000
    Mean
##
           :341.3
                                                       Mean
                                                              :4.094
    3rd Qu.:516.0
                                                       3rd Qu.:6.000
##
   Max.
           :941.0
                                                      Max.
                                                              :6.000
##
                                         Speed limit
##
   First Road Number
                        Road_Type
                                                         Junction Detail
                                        Min. : 0.00
   Min. :
               0.0
                      Min.
                            :-1.000
                                                        Min.
                                                                :-1.000
    1st Qu.:
                      1st Qu.: 6.000
                                        1st Qu.:30.00
                                                         1st Qu.: 0.000
##
               0.0
##
    Median: 62.0
                      Median : 6.000
                                        Median :30.00
                                                        Median: 1.000
##
    Mean
          : 906.4
                      Mean
                            : 5.156
                                        Mean
                                               :38.97
                                                         Mean
                                                               : 2.238
    3rd Qu.: 633.0
                      3rd Qu.: 6.000
                                        3rd Qu.:50.00
                                                         3rd Qu.: 3.000
##
           :9918.0
                            : 9.000
                                               :70.00
    Max.
                      Max.
                                        Max.
                                                         Max.
                                                                : 9.000
##
                                        NA's
                                               :47
    Junction_Control Second_Road_Class Second_Road_Number
##
           :-1.000
                           :-1.000
                                              : -1.0
   Min.
                     Min.
                                        Min.
##
    1st Qu.:-1.000
                     1st Qu.:-1.000
                                        1st Qu.:
                                                   0.0
##
    Median : 2.000
                     Median : 3.000
                                        Median :
                                                   0.0
          : 1.608
                            : 2.576
                                               : 319.8
                     Mean
                                        Mean
                     3rd Qu.: 6.000
    3rd Qu.: 4.000
##
                                        3rd Qu.:
                                                   0.0
##
    Max.
           : 4.000
                     Max.
                            : 6.000
                                        Max.
                                               :9999.0
##
   Pedestrian_Crossing_Human_Control Pedestrian_Crossing_Physical_Facilities
   Min. :-1.000000
##
                                       Min.
                                              :-1.0000
```

```
## 1st Qu.: 0.000000
                                   1st Qu.: 0.0000
## Median: 0.000000
                                   Median: 0.0000
## Mean : 0.005251
                                   Mean : 0.8015
## 3rd Qu.: 0.000000
                                   3rd Qu.: 0.0000
## Max. : 2.000000
                                   Max. : 8.0000
##
## Light Conditions Weather Conditions Road Surface Conditions
                   Min. :-1.00
                                     Min. :-1.000
## Min. :-1.000
   1st Qu.: 1.000
                   1st Qu.: 1.00
                                      1st Qu.: 1.000
##
  Median : 1.000
                   Median: 1.00
                                     Median : 1.000
## Mean : 2.019
                   Mean : 1.56
                                     Mean : 1.295
   3rd Qu.: 4.000
                   3rd Qu.: 1.00
                                      3rd Qu.: 2.000
##
                                     Max. : 5.000
## Max. : 7.000
                   Max. : 9.00
##
## Special_Conditions_at_Site Carriageway_Hazards Urban_or_Rural_Area
## Min. :-1.00000
                             Min. :-1.00000
                                                Min. :-1.000
##
  1st Qu.: 0.00000
                             1st Qu.: 0.00000
                                                1st Qu.: 1.000
## Median : 0.00000
                             Median : 0.00000
                                                Median : 1.000
## Mean : 0.08974
                             Mean : 0.05498
                                                Mean : 1.374
                                                3rd Qu.: 2.000
## 3rd Qu.: 0.00000
                             3rd Qu.: 0.00000
## Max. : 7.00000
                             Max. : 7.00000
                                                Max. : 3.000
##
## Did_Police_Officer_Attend_Scene_of_Accident LSOA_of_Accident_Location
## Min. :-1.000
                                             Length: 699163
  1st Qu.: 1.000
##
                                             Class : character
## Median: 1.000
                                             Mode :character
## Mean : 1.225
   3rd Qu.: 1.000
## Max. : 3.000
##
##
       Date
                      TimeGroup
                                        Accident_Index
                                                          Vehicle_Reference
##
   Length:699163
                     Length:699163
                                       Length:699163
                                                         Min. : 1.000
                                        Class :character
                                                          1st Qu.: 1.000
   Class : character
                     Class :character
##
   Mode :character
                     Mode :character
                                       Mode :character
                                                          Median: 1.000
                                                          Mean : 1.488
##
##
                                                          3rd Qu.: 2.000
##
                                                          Max.
                                                               :999.000
##
##
    Vehicle_Type
                   Towing and Articulation Vehicle Manoeuvre
  Min. :-1.000
                   Min. :-1.000000
                                          Min. :-1.00
##
  1st Qu.: 9.000
                   1st Qu.: 0.000000
                                          1st Qu.: 9.00
## Median : 9.000
                   Median : 0.000000
                                          Median :18.00
   Mean : 8.714
                   Mean : 0.006878
                                          Mean :13.37
##
   3rd Qu.: 9.000
                   3rd Qu.: 0.000000
                                          3rd Qu.:18.00
## Max. :98.000
                   Max. : 5.000000
                                          Max. :18.00
##
## Vehicle_Location_Restricted_Lane Junction_Location Skidding_and_Overturning
## Min. :-1.0000
                                   Min. :-1.000
                                                    Min. :-1.000
## 1st Qu.: 0.0000
                                   1st Qu.: 0.000
                                                    1st Qu.: 0.000
                                   Median : 1.000
## Median : 0.0000
                                                    Median : 0.000
## Mean : 0.1509
                                   Mean : 2.364
                                                    Mean : 0.294
## 3rd Qu.: 0.0000
                                   3rd Qu.: 5.000
                                                    3rd Qu.: 0.000
## Max. : 9.0000
                                  Max. : 8.000
                                                    Max.
                                                           : 5.000
##
```

```
Hit_Object_in_Carriageway Vehicle_Leaving_Carriageway
##
   Min.
         :-1.0000
                             Min.
                                   :-1.0000
##
   1st Qu.: 0.0000
                             1st Qu.: 0.0000
  Median : 0.0000
                             Median : 0.0000
##
   Mean : 0.4397
                             Mean
                                    : 0.5006
##
   3rd Qu.: 0.0000
                             3rd Qu.: 0.0000
##
   Max. :12.0000
                             Max. : 8.0000
##
   Hit_Object_off_Carriageway First_Point_of_Impact Was_Vehicle_Left_Hand_Drive
##
   Min. :-1.0000
                              Min. :-1.000
                                                    Min. :-1.0000
   1st Qu.: 0.0000
                              1st Qu.: 1.000
                                                    1st Qu.: 1.0000
   Median : 0.0000
                              Median : 1.000
                                                    Median : 1.0000
##
   Mean : 0.7287
                              Mean : 1.776
                                                    Mean
                                                         : 0.9775
##
   3rd Qu.: 0.0000
                              3rd Qu.: 3.000
                                                    3rd Qu.: 1.0000
##
   Max.
          :11.0000
                              Max. : 4.000
                                                    Max.
                                                          : 2.0000
##
##
   Journey_Purpose_of_Driver Sex_of_Driver
                                              Age_of_Driver
                                                              Age_Band_of_Driver
   Min. :-1.000
                             Min. :-1.000
                                              Min. : -1.00
                                                              Min. :-1.000
   1st Qu.: 3.000
                             1st Qu.: 1.000
                                              1st Qu.: 25.00
                                                              1st Qu.: 5.000
##
   Median : 6.000
                             Median : 1.000
##
                                              Median : 36.00
                                                              Median : 7.000
##
   Mean : 4.738
                             Mean
                                    : 1.362
                                              Mean : 37.88
                                                              Mean
                                                                    : 6.468
   3rd Qu.: 6.000
                             3rd Qu.: 2.000
                                              3rd Qu.: 50.00
                                                              3rd Qu.: 8.000
   Max. : 6.000
                                    : 3.000
##
                             Max.
                                              Max.
                                                    :101.00
                                                              Max.
                                                                     :11.000
##
##
                                        Age of Vehicle
   Engine Capacity CC Propulsion Code
                                                          Driver IMD Decile
   Min. : -1
                      Min.
                            :-1.0000
                                        Min. : -1.000
                                                         Min. :-1.000
##
   1st Qu.: 124
                      1st Qu.: 1.0000
                                        1st Qu.: -1.000
                                                          1st Qu.:-1.000
   Median: 1360
                      Median : 1.0000
                                        Median : 5.000
                                                          Median : 2.000
##
   Mean : 1323
                      Mean
                            : 0.9135
                                        Mean
                                             : 5.755
                                                          Mean
                                                               : 2.434
                                                          3rd Qu.: 5.000
   3rd Qu.: 1797
                      3rd Qu.: 2.0000
                                        3rd Qu.: 10.000
##
   Max. :91000
                      Max.
                             :12.0000
                                        Max.
                                               :105.000
                                                          Max. :10.000
##
   Driver_Home_Area_Type Vehicle_IMD_Decile Accident_Index
##
                                                              Vehicle_Reference
   Min. :-1.0000
                         Min. :-1.000
                                            Length:699163
                                                              Min. : 1.000
                                                              1st Qu.: 1.000
   1st Qu.: 1.0000
                         1st Qu.:-1.000
##
                                            Class : character
##
   Median: 1.0000
                         Median : 2.000
                                            Mode :character
                                                              Median: 1.000
   Mean : 0.9852
                         Mean : 2.434
                                                              Mean : 1.488
##
   3rd Qu.: 1.0000
                         3rd Qu.: 5.000
                                                              3rd Qu.: 2.000
##
   Max. : 3.0000
                         Max. :10.000
                                                              Max.
                                                                     :999.000
##
   Casualty Reference Casualty Class Sex of Casualty Age of Casualty
         : 1.000
##
   Min.
                      Min. :1.00
                                     Min. :-1.000
                                                      Min. : -1.00
   1st Qu.: 1.000
                      1st Qu.:1.00
                                     1st Qu.: 1.000
                                                      1st Qu.: 22.00
##
   Median : 1.000
                      Median :1.00
                                                      Median : 33.00
                                     Median : 1.000
                                                            : 36.48
   Mean
         : 1.406
                      Mean
                             :1.49
                                     Mean
                                           : 1.406
                                                      Mean
   3rd Qu.: 2.000
                      3rd Qu.:2.00
                                     3rd Qu.: 2.000
                                                      3rd Qu.: 50.00
##
                             :3.00
##
   Max. :991.000
                      Max.
                                     Max. : 2.000
                                                      Max.
                                                             :104.00
##
   Age_Band_of_Casualty Casualty_Severity Pedestrian_Location Pedestrian_Movement
##
   Min. :-1.000
                        Min. :1.000
                                          Min.
                                               :-1.000
                                                             Min.
                                                                    :-1.0000
##
   1st Qu.: 5.000
                        1st Qu.:3.000
                                          1st Qu.: 0.000
                                                             1st Qu.: 0.0000
## Median : 6.000
                        Median :3.000
                                          Median : 0.000
                                                             Median : 0.0000
## Mean : 6.289
                        Mean :2.842
                                          Mean : 0.714
                                                             Mean : 0.5418
   3rd Qu.: 8.000
                        3rd Qu.:3.000
                                                             3rd Qu.: 0.0000
                                          3rd Qu.: 0.000
```

```
##
   Max.
         :11.000
                        Max.
                               :3.000
                                          Max.
                                                 :10.000
                                                              Max.
                                                                     : 9.0000
##
##
  Car Passenger
                     Bus_or_Coach_Passenger Pedestrian_Road_Maintenance_Worker
## Min. :-1.0000
                     Min. :-1.00000
                                                 :-1.00000
                                            Min.
   1st Qu.: 0.0000
                     1st Qu.: 0.00000
                                            1st Qu.: 0.00000
## Median : 0.0000
                    Median : 0.00000
                                            Median : 0.00000
## Mean : 0.2523
                    Mean : 0.07744
                                            Mean : 0.07626
## 3rd Qu.: 0.0000
                     3rd Qu.: 0.00000
                                            3rd Qu.: 0.00000
## Max. : 2.0000
                    Max. : 4.00000
                                            Max.
                                                 : 2.00000
##
                    Casualty_Home_Area_Type Casualty_IMD_Decile
## Casualty_Type
## Min. :-1.000
                           :-1.000
                                            Min. :-1.000
                    Min.
## 1st Qu.: 3.000
                                            1st Qu.: 1.000
                    1st Qu.: 1.000
                                            Median : 4.000
## Median : 9.000
                    Median : 1.000
## Mean : 7.281
                    Mean : 0.986
                                            Mean : 3.714
## 3rd Qu.: 9.000
                    3rd Qu.: 1.000
                                            3rd Qu.: 7.000
## Max. :98.000
                                            Max. :10.000
                    Max. : 3.000
##
# write.csv(All_Accident_Data, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/Amplify_Inter
Accidents Vehicles Casualties <- sqldf(
 "-- How many accidents had how many vehicles and casualties?
 count(a.Accident_Index) AS Count_Incidents,
 v. Vehicle_Reference,
 c.Casualty_Reference
 from UK_AccidentData as a
 join UK_VehicleData as v
   on a.Accident_Index=v.Accident_Index
 join UK_CasualtyData as c
   on a.Accident_Index=c.Accident_Index
   and v. Vehicle Reference=c. Vehicle Reference
 group by
 v. Vehicle_Reference,
 c.Casualty_Reference
 order by
 v. Vehicle_Reference,
 c.Casualty_Reference")
# View(All_Accident_Data)
head(Accidents_Vehicles_Casualties)
    Count_Incidents Vehicle_Reference Casualty_Reference
## 1
             329081
                                    1
                                                       1
## 2
              41015
                                    1
                                                       2
                                                       3
## 3
              14104
                                    1
## 4
               4901
                                    1
                                                       4
```

1

5

5

1663

6 568 1 6

summary(Accidents_Vehicles_Casualties) ## Count_Incidents Vehicle_Reference Casualty_Reference ## Min. : 1.0 Min. : 1.000 Min. : 1.00 1.0 1st Qu.: 2.000 1st Qu.: 5.00 ## 1st Qu.: ## Median : 2.5 Median: 3.000 Median: 13.00 ## Mean : 2515.0 Mean : 9.932 Mean : 22.28 ## 3rd Qu.: 13.8 3rd Qu.: 8.000 3rd Qu.: 29.00 ## Max. :329081.0 Max. :999.000 Max. :991.00 # write.csv(Accidents_Vehicles_Casualties, "C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!Datasets/A Accidents_Light_Weather <- sqldf(</pre> "-- How many accidents had how many vehicles and casualties? select count(a.Accident_Index) AS Count_Incidents, a.Light_Conditions, a.Weather_Conditions, a.Road_Surface_Conditions, v.Vehicle_Reference, c.Casualty_Reference from UK_AccidentData as a join UK_VehicleData as v on a.Accident_Index=v.Accident_Index join UK_CasualtyData as c on a.Accident_Index=c.Accident_Index and v.Vehicle_Reference=c.Vehicle_Reference where a.Light_Conditions <> '-1' and a.Weather_Conditions <> '-1' and a.Road_Surface_Conditions <> '-1' group by a.Light_Conditions, a.Weather_Conditions, a.Road_Surface_Conditions, v. Vehicle_Reference, c.Casualty_Reference order by v.Vehicle_Reference, c.Casualty_Reference") # View(All_Accident_Data)

Count_Incidents Light_Conditions Weather_Conditions Road_Surface_Conditions

head(Accidents_Light_Weather)

```
## 1
                 170261
                                           1
                                                                   1
                                                                                                1
## 2
                  20631
                                           1
                                                                                                2
                                                                   1
## 3
                    131
                                           1
                                                                   1
                                                                                                3
                                                                                                4
## 4
                   2040
                                           1
                                                                   1
## 5
                     34
                                           1
                                                                   1
                                                                                                5
## 6
                    325
                                           1
                                                                   2
                                                                                                1
##
      Vehicle_Reference Casualty_Reference
## 1
                         1
                                                1
## 2
                         1
                                                1
## 3
                         1
                                                1
## 4
                         1
                                                1
## 5
                         1
                                                1
## 6
                         1
                                                1
```

summary(Accidents_Light_Weather)

```
Light_Conditions Weather_Conditions Road_Surface_Conditions
##
    Count_Incidents
##
    Min.
           :
                  1.0
                        Min.
                               :1.000
                                          Min.
                                                  :1.000
                                                              Min.
                                                                      :1.000
                        1st Qu.:1.000
    1st Qu.:
                                          1st Qu.:1.000
                                                              1st Qu.:1.000
##
                  1.0
##
    Median:
                  3.0
                        Median :4.000
                                          Median :3.000
                                                              Median :2.000
##
    Mean
                262.6
                        Mean
                                :3.605
                                          Mean
                                                  :3.935
                                                              Mean
                                                                      :2.222
##
    3rd Qu.:
                 12.0
                        3rd Qu.:6.000
                                          3rd Qu.:7.000
                                                              3rd Qu.:3.000
##
    Max.
           :170261.0
                        Max.
                                :7.000
                                          Max.
                                                  :9.000
                                                              Max.
                                                                      :5.000
##
    Vehicle_Reference Casualty_Reference
##
              1.000
                       Min.
                              : 1.00
##
    1st Qu.:
              1.000
                       1st Qu.:
                                 2.00
##
    Median :
              2.000
                       Median :
                                 3.00
##
    Mean
              3.295
                                 5.94
                       Mean
    3rd Qu.:
              3.000
                       3rd Qu.:
                                 5.00
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 $\textit{\# write.csv} (\textit{Accidents_Light_Weather}, \textit{"C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!} \textit{Datasets/Amplify} (\textit{Accidents_Light_Weather}, \textit{C:/Users/darre/My Drive (dwolfe.data@gmail.com)/!} \textit{Datasets/Amplify} (\textit{C:/Users/darre/My Drive (dwolfe.data@gmail.com)} (\textit{C:/Users/darre/My Drive (dwolfe.data@gmail.com)} (\textit{C:/Users/darre/My Drive (dwolfe.data@gmail.com)} (\textit{C:/Users/darre/My Drive (dwolfe.data@gmail.co$

Visualizations in Tableau

Initial Analysis and Views complete for now with a handful of key insights. I really want to see the data in visualizations. I saved the three cleaned tables as CSVs, as well as a few key views that might be interesting.

I will port these plus the codes tables to Tableau and see what happens when we begin visualizing these insights and looking for stuff I cannot do in R (because Google maps requires a paid API to use the plot map in R).

The Data Stories

The following data stories came to light throughout this analysis:

In 2015-2018, there were an aggregate total of 151.269 accidents and 593.391 casualties.

Accidents decreased dramatically during these years, possibly indicating a combination of safer vehicles, driver awareness, new laws, and other factors.

There were no indications that any particular month or season was more dangerous.

Weekdays are the most dangerous, especially Fridays.

While Fatal and Serious accidents do not show a preference for the day of the week, Slight injuries are reported at higher frequency on weekdays, with the highest on Fridays. Although the number of accidents have steadily dropped from 2015-2018 (the timeframe of the study).

Afternoon and Evening Commutes are most dangerous. The hours of 1p to 5p are the most likely times for an accident, followed closely by the hours of 5p to 8p. Most accidents occurred during daylight, following by well lit nights, which coincides with these findings.

Note: the "Evening Late/Late Night" categories could have been spread across times better. This was an oversight, and would be corrected upon an updated version.

Types of Roads and Lanes did not show any particularly interesting patterns, but two maps were included as reference.

While there were more male drivers than female, and more male casualties than female, the distribution of injuries Fatal, Serious, and Slight were correlated to those numbers and did not reveal anything interesting.

However, while males were the driver more often, females were injured as passangers more often. And rear-seat injuries were far less common than front seat injuries.

One vehicle Manoeuvre shows to be involved in more accidents than any other, "Going ahead", which indicates a state known as Road Hypnosis. (Shi et al. 2023)

Ages: While at first ages seem to show more accidents for those 26-35 with a bell curve on either side, this also correlates with the working population. Therefore, this may only be a reflection and not an indication. When comparing this to the population data (from WikiMedia Commons), this guess held true.

Speed Limit: One speed limit (30 MPH (or is that KMH?) has a higher representation of accidents than all others. This seems highly correlated with the fact that most accidents occur in urban city areas and during afternoon or commute hours.

Vehicles 26-35 years old played an outsized role in accidents, however, the age bands showed a bell curve, which is likely an indication of the population of vehicles available for accident incidents.

The Index of Multiple Deprivation (IMD) did show that accidents in deprived regions were higher, this may reflect multiple factors including access to safer vehicles and local budgets for road maintenance.

Accidents involving one vehicle were most common, followed by those involving two, with a representation for third vehicles. Very few involved more than three.

Surprisingly, most accidents occurred with one vehicle in daylight hours on dry single-lane roads, while driving straight ahead (not while navigating a turn or intersection).

This reminded me of a term I had heard called Road Hypnosis; which is especially important in North Idaho, USA. This occurs when the driver is taking a well known route and driving straight ahead. The human brain has evolved to only store important information, and a well-known straight route does not fall into this category. The brain goes into a form of autopilot, and drivers sometimes tell stories of having arrived at home after work without remembering the drive. In this auto-pilot state, one can miss clues that something has changed or even drift off the road entirely.

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Conclusions

Some conditions can make it more likely for an accident to occur.

Driving in the afternoons or on the way home after work.

Driving on long straight routes in good weather (leading to carelessness).

Driving an older vehicle, in urban city regions, or in areas where the IMD index indicates the possibility of dangerous factors.

Driving in regions where the speed limit is lower may lead to accidents (for reasons not investigated in this analysis).

Note: If a passenger, chosing the rear seat may prevent or lessen injury in case of an accident.

Presentation

- Technical Review: Provide the Word Doc and PDF version of the Rmd file for those wanting to look into the technical review.
 - UK Road Safety, Technical Analysis, Darrell Wolfe, (Temporary Demo Page Topos Creative, LLC)
 - Google Drive: Word Doc & PDF Doc
- Tableau Public: Provide link to the Tableau Public presentation for the users to click and explore the data.
 - Link Here
- GitHub: Provide the GitHub link to this project:
 - GitHub_UK Road Safety Repo
- Google Drive: Provide link to files used for this exercise, including the Power Query transformation and re-organized CSVs.
 - UK Road Safety, Darrell Wolfe Analysis, Google Drive Files
- Some final data story format... Slides? Rmd to PDF? Undecided.

The End of this document... but not the data stories.

Shi, Huili, Longfei Chen, Xiaoyuan Wang, Bin Wang, Gang Wang, and Fusheng Zhong. 2023. "Research on Recognition of Road Hypnosis in the Typical Monotonous Scene." Sensors (Basel, Switzerland) 23 (3): 1701. https://doi.org/10.3390/s23031701.