Exploratory Data Analysis

DSAN 5300

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In this notebook, we will explore the NHTS data set in order to understand the data and determine what data modeling steps to take.

library(tidyverse)

library(arrow)

Attaching package: 'arrow'

```
duration
The following object is masked from 'package:utils':
    timestamp
household <- read_parquet("../../data/clean/household.parquet")
long_distance <- read_parquet("../../data/clean/long_distance.parquet")
person <- read_parquet("../../data/clean/person.parquet")
trip <- read_parquet("../../data/clean/trip.parquet")
vehicle <- read_parquet("../../data/clean/vehicle.parquet")</pre>
```

The following object is masked from 'package:lubridate':

Household Data

```
household |> glimpse()
```

```
Rows: 7,893
Columns: 35
$ household_id
                                 <chr> "9000013002", "9000013016", "9000013026~
$ household_weight_7_day
                                 <dbl> 4621.758, 2982.998, 9979.573, 10355.891~
$ household_weight_5_day
                                 <dbl> 0.000, 3878.814, 14700.797, 13150.679, ~
                                 <dbl> 13946.19, 0.00, 0.00, 0.00, 0.00, 0.00,~
$ household_weight_2_day
$ num_adults_in_household
                                 <dbl> 2, 2, 1, 2, 1, 2, 1, 2, 2, 2, 1, 2, 2, ~
                                 <dbl> 2, 2, 1, 2, 1, 2, 1, 2, 1, 2, 0, 2, 2, ~
$ num_drivers_in_household
$ count_household_trips
                                 <dbl> 7, 6, 0, 2, 0, 4, 1, 4, 8, 0, 0, 6, 7, ~
                                 <dbl> 4, 2, 1, 4, 1, 3, 1, 2, 2, 2, 1, 5, 2, ~
$ household_size
$ num_vehicles_in_household
                                 <dbl> 2, 1, 0, 1, 1, 2, 1, 2, 1, 2, 0, 2, 3, ~
$ num_children_5_17
                                 <dbl> 2, 0, 0, 2, 0, 0, 0, 0, 0, 0, 0, 1, 0, ~
                                 <dbl> 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 2, 0, ~
$ num_children_under_5
$ num respondents in household
                                 <dbl> 4, 2, 1, 4, 1, 2, 1, 2, 2, 2, 1, 3, 2, ~
$ travel_day_date
                                 <chr> "202202", "202202", "202202", "202201",~
$ WRKCOUNT
                                 <dbl> 1, 2, 1, 1, 1, 2, 0, 2, 2, 0, 0, 1, 1, ~
$ household_stratum_id
                                 <chr> "1021", "1021", "1021", "1021", "1021", "
                                 <chr> "New England MSA/CMSA of 1 million+ wit~
$ household_grouping
                                 <chr> "New England", "New England", "New Engl~
$ census_division
                                 <chr> "Northeast", "Northeast", "Northeast", ~
$ census_region
$ all_household_completed_survey <chr> "All eligible household members complet~
                                  <chr> "$200,000 or more", "$75,000 to $99,999~
$ household_income
```

```
$ household_income_imputed
                                 <chr> "$200,000 or more", "$75,000 to $99,999~
$ household_related
                                 <chr> "At least two persons in hh are related~
                                 <chr> "Not Hispanic or Latino", "Not Hispanic~
$ hispanic
$ race
                                 <chr> "White", "White", "White", "Wh-
                                 <chr> "Owned by hh member with mortgage or lo~
$ own or rent home
                                 <chr> "One-family detached", "Building with 2~
$ home_type
$ LIF CYC
                                 <chr> "2+ adults, youngest child 0-5", "2+ ad~
                                 <chr> "MSA of 1 million or more, with rail", ~
$ metro_area_category
                                 <chr> "In an MSA or CMSA of 3 million or more~
$ metro_area_size
                                 <chr> "Yes", "No", "Yes", "Yes", "No", "Yes",~
$ metro_rail_status
                                 <chr> "Sunday", "Wednesday", "Tuesday", "Thur~
$ travel_day_of_week
$ household_urban_classification <chr> "In an urban area", "In an urban area",~
                                 <chr> "1,000,000 or more with heavy rail", "2~
$ household_urban_size
                                 <chr> "Urban", "Urban", "Urban", "Urban", "Ur-
$ household_urban_rural
                                 <chr> "Urban", "Urban", "Urban", "Urban", "Ur~
$ household_urban_rural_2010
```

household |> summary()

```
household id
                   household weight 7 day household weight 5 day
Length: 7893
                          : 100.8
                                           Min.
                   1st Qu.: 6571.7
                                           1st Qu.:
Class :character
Mode :character
                   Median:11529.1
                                           Median: 10534
                                                   : 16159
                   Mean
                           :16159.2
                                           Mean
                    3rd Qu.:20636.0
                                           3rd Qu.: 22549
                   Max.
                           :81832.0
                                           Max.
                                                   :112970
household_weight_2_day num_adults_in_household num_drivers_in_household
Min.
             0
                        Min.
                               :1.000
                                                 Min.
                                                        :0.000
1st Qu.:
                        1st Qu.:1.000
             0
                                                 1st Qu.:1.000
Median :
                        Median :2.000
                                                 Median :2.000
Mean
       : 16159
                        Mean
                               :1.839
                                                 Mean
                                                        :1.714
3rd Qu.: 15082
                        3rd Qu.:2.000
                                                 3rd Qu.:2.000
                               :8.000
Max.
       :264588
                        Max.
                                                 Max.
                                                        :7.000
count_household_trips household_size
                                        num_vehicles_in_household
                              : 1.000
Min.
      : 0.000
                      Min.
                                        Min.
                                                : 0.00
1st Qu.: 2.000
                       1st Qu.: 1.000
                                        1st Qu.: 1.00
Median : 3.000
                      Median : 2.000
                                        Median: 2.00
Mean
       : 3.937
                      Mean
                              : 2.272
                                        Mean
                                                : 1.86
3rd Qu.: 6.000
                      3rd Qu.: 3.000
                                        3rd Qu.: 2.00
       :45.000
                      Max.
                              :10.000
                                        Max.
                                                :17.00
num_children_5_17 num_children_under_5 num_respondents_in_household
                          :0.0000
                                                : 1.000
Min.
       :0.000
                  Min.
                                        Min.
1st Qu.:0.000
                  1st Qu.:0.0000
                                        1st Qu.: 1.000
```

Median :0.000 Median :0.0000 Median : 2.000 Mean :0.328 Mean :0.1045 Mean : 2.153 3rd Qu.:0.000 3rd Qu.:0.0000 3rd Qu.: 3.000 Max. :6.000 Max. :4.0000 Max. :10.000

travel_day_date WRKCOUNT household_stratum_id household_grouping

Length:7893 Min.:0.0000 Length:7893 Length:7893
Class:character 1st Qu::0.0000 Class:character Class:character Mode:character Mode:character Mode:character

Mean :0.9966 3rd Qu.:2.0000

Max. :6.0000

census_division census_region all_household_completed_survey

Length:7893 Length:7893 Length:7893
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

 $\verb|household_income_imputed household_related|\\$

Length:7893 Length:7893 Length:7893
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

hispanic own_or_rent_home race home_type Length: 7893 Length: 7893 Length: 7893 Length: 7893 Class :character Class : character Class : character Class : character Mode :character Mode :character Mode :character Mode :character

LIF_CYC metro_area_category metro_area_size metro_rail_status

Length:7893 Length:7893 Length:7893 Length:7893
Class:character Class:character Class:character Mode:character Mode:character

travel_day_of_week household_urban_classification household_urban_size

Length:7893 Length:7893 Length:7893

Class : character Class : character Class : character Mode : character Mode : character Mode : character Class : character Class : character Mode : character Mode : character

household_urban_rural household_urban_rural_2010

Length:7893 Length:7893
Class:character Class:character
Mode:character Mode:character

```
# Corr plot
household |>
    select(-household_id) |>
    select(where(is.numeric)) |>
    cor() |>
    corrplot::corrplot(
        method = "color",
        type = "upper",
        tl.col = "black",
        tl.srt = 45,
        addCoef.col = "black",
    )
```



Long Distance Data

long_distance |> glimpse()

```
Rows: 16,997
Columns: 66
                                              <chr> "9000013002", "9000013002",~
$ household_id
$ person_id
                                              <chr> "01", "02", "03", "04", "01~
$ LONGDIST
                                             <dbl> 1, 1, 0, 0, 0, 0, 1, 0, 0, ~
                                             <dbl> 2, 2, 5, 5, 2, 2, 1, 4, 4, ~
$ num_people_on_long_distance_trip
$ num_used_amtrak_last_year
                                             <dbl> 0, 0, 0, 0, 0, 0, 2, 0, 0, ~
                                              <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
$ num_used_intracity_bus_last_year
$ num_nights_away_from_home
                                              <dbl> 3, 3, -9, -9, -9, -9, 8, -9~
$ great_circle_distance_traveled
                                              <dbl> 61.86880, 61.86880, 382.211~
$ num_adults_in_household
                                             <dbl> 2, 2, 2, 2, 2, 1, 2, 2, ~
$ num_drivers_in_household
                                             <dbl> 2, 2, 2, 2, 2, 1, 2, 2, ~
                                             <dbl> 4, 4, 4, 4, 2, 2, 1, 4, 4, ~
$ household_size
$ num_vehicles_in_household
                                              <dbl> 2, 2, 2, 2, 1, 1, 0, 1, 1, ~
$ travel_day_date
                                              <chr> "202202", "202202", "202202~
$ WRKCOUNT
                                              <dbl> 1, 1, 1, 1, 2, 2, 1, 1, 1, ~
$ household_stratum_id
                                              <chr> "1021", "1021", "1021", "10~
                                             <dbl> 3938.689, 5409.515, 3013.58~
$ person_weight_7_day
                                             <dbl> 0.000, 0.000, 0.000, 0.000,~
$ person_weight_5_day
                                             <dbl> 13363.809, 19360.095, 7285.~
$ person_weight_2_day
                                             <dbl> 39, 42, 8, 5, 32, 41, 44, 3~
$ respondent_age
                                             <chr> "Valid Skip", "Valid Skip",~
$ airport_size
$ begin_trip_date
                                             <chr> NA, NA, "Not ascertained", ~
$ household_grouping
                                             <chr> "New England MSA/CMSA of 1 ~
$ census_division
                                             <chr> "New England", "New England~
                                             <chr> "Northeast", "Northeast", "~
$ census_region
$ DRIVER
                                              <chr> "Yes", "Yes", "Valid skip",~
$ education_level
                                             <chr> "Master's degree", "Master'~
$ ENDTRIP
                                              <chr> NA, NA, "Not ascertained", ~
                                              <chr> "Valid Skip", "Valid Skip",~
$ exit_census_division
                                              <chr> "New England", "New England~
$ farthest_census_division_traveled
$ farthest_census_region_traveled
                                              <chr> "Northeast", "Northeast", "~
$ reason_for_travel
                                              <chr> "Personal vacation", "Perso~
$ great_circle_distance_longer_than_50_miles <chr>> "GCD 50 miles or more", "GC~
                                             <chr> "$200,000 or more", "$200,0~
$ household_income
$ household_income_imputed
                                             <chr> "$200,000 or more", "$200,0~
                                             <chr> "Not Hispanic or Latino", "~
$ hispanic
```

\$ race <chr> "White", "White", "White", ~ \$ own_or_rent_home <chr> "Owned by hh member with mo~ <chr> "Inside the US", "Inside th~ \$ international_trip \$ long_distance_trip <chr> "Long distance info asked o~ <chr> "2+ adults, youngest child ~ \$ LIF CYC \$ main_mode_of_transport <chr> "Car", "SUV/Crossover", "SU~ \$ date of most recent trip <chr> NA, NA, "Not ascertained", ~ \$ metro_area_category <chr> "MSA of 1 million or more, ~ <chr> "In an MSA or CMSA of 3 mil~ \$ metro_area_size <chr> "On trip", "On trip", "On t~ \$ person_1_on_long_distance_trip <chr> "Not ascertained", "Not asc~ \$ person_10_on_long_distance_trip <chr> "On trip", "On trip", "On t~ \$ person_2_on_long_distance_trip <chr> "Not on trip", "Not on trip~ \$ person_3_on_long_distance_trip <chr> "Not on trip", "Not on trip~ \$ person_4_on_long_distance_trip <chr> "Not ascertained", "Not asc~ \$ person_5_on_long_distance_trip <chr> "Not ascertained", "Not asc~ \$ person_6_on_long_distance_trip <chr> "Not ascertained", "Not asc~ \$ person_7_on_long_distance_trip \$ person_8_on_long_distance_trip <chr> "Not ascertained", "Not asc~ \$ person_9_on_long_distance_trip <chr> "Not ascertained", "Not asc~ \$ proxy_respondent <chr> "Self", "Someone else", "So~ <chr> "Yes", "Yes", "Yes", "Yes",~ \$ metro_rail_status <chr> "Not Hispanic", "Not Hispan~ \$ respondent hispanic \$ respondent_race <chr> "White", "White", "White", ~ <chr> "Female", "Male", "Refuse",~ \$ respondent sex \$ respondent_sex_imputed <chr> "Female", "Male", "Male", "~ <chr> "Sunday", "Sunday", "Sunday~ \$ travel_day_of_week \$ household_urban_classification <chr> "In an urban area", "In an ~ \$ household_urban_size <chr> "1,000,000 or more with hea~ <chr> "Urban", "Urban", "Urban", ~ \$ household_urban_rural \$ trip_includes_weekend <chr> "Long weekend (4 to 6 days ~ <chr> "Not worker", "Worker", "Va~ \$ worker_status

long_distance |> summary()

household_id person_id LONGDIST Length: 16997 Length: 16997 Min. : 0.000 Class : character Class : character 1st Qu.: 0.000 Mode :character Mode :character Median : 0.000 Mean : 1.701 3rd Qu.: 1.000 :207.000 Max. num_people_on_long_distance_trip num_used_amtrak_last_year

```
Min.
       :-9.000
                                 Min.
                                         : 0.00000
1st Qu.: 1.000
                                 1st Qu.: 0.00000
Median : 2.000
                                 Median: 0.00000
Mean
      : 1.932
                                 Mean
                                        : 0.06642
3rd Qu.: 3.000
                                 3rd Qu.: 0.00000
Max.
       :99.000
                                 Max.
                                         :35.00000
num used intracity bus last year num nights away from home
Min.
       : 0.00000
                                 Min.
                                         :-9.000
1st Qu.:
          0.00000
                                 1st Qu.:-9.000
Median :
                                 Median :-1.000
          0.00000
                                         :-3.037
Mean
      :
          0.08131
                                 Mean
3rd Qu.:
          0.00000
                                 3rd Qu.: 0.000
                                         :31.000
Max.
       :100.00000
                                 Max.
great_circle_distance_traveled num_adults_in_household
                                      :1.000
      : -9.00
                               Min.
1st Qu.: 11.26
                               1st Qu.:2.000
Median: 79.33
                               Median :2.000
Mean
      : 258.11
                               Mean
                                      :2.135
3rd Qu.: 241.79
                               3rd Qu.:2.000
Max.
       :5005.86
                               Max.
                                       :8.000
num drivers in household household size
                                         num vehicles in household
                         Min.
                                : 1.00
                                         Min.
Min.
       :0.000
                                                 : 0.000
1st Qu.:2.000
                         1st Qu.: 2.00
                                         1st Qu.: 1.000
Median :2.000
                         Median: 2.00
                                         Median : 2.000
Mean
       :1.998
                         Mean : 2.91
                                         Mean
                                                 : 2.098
3rd Qu.:2.000
                         3rd Qu.: 4.00
                                         3rd Qu.: 3.000
       :7.000
                         Max.
                                :10.00
                                         Max.
                                                 :17.000
Max.
travel_day_date
                      WRKCOUNT
                                   household_stratum_id person_weight_7_day
Length: 16997
                                   Length: 16997
                                                         Min.
                   Min.
                          :0.000
                                                               :
                                                                     30.9
Class : character
                   1st Qu.:0.000
                                   Class : character
                                                         1st Qu.: 5614.8
Mode :character
                   Median :1.000
                                   Mode :character
                                                         Median: 10798.7
                   Mean
                          :1.216
                                                         Mean
                                                                : 17977.3
                   3rd Qu.:2.000
                                                         3rd Qu.: 21084.0
                   Max.
                          :6.000
                                                         Max.
                                                                :781700.0
person_weight_5_day person_weight_2_day respondent_age
                                                         airport size
Min.
      :
             0
                    Min.
                          :
                                 0
                                        Min.
                                               : 5.00
                                                         Length: 16997
                    1st Qu.:
                                                         Class : character
1st Qu.:
                                 0
                                        1st Qu.:28.00
Median: 9142
                    Median:
                                        Median :48.00
                                                         Mode :character
Mean
      : 17977
                    Mean : 17977
                                        Mean
                                               :45.92
3rd Qu.: 22271
                    3rd Qu.: 11093
                                        3rd Qu.:65.00
Max.
       :972351
                    Max.
                           :473082
                                        Max.
                                               :92.00
begin_trip_date
                   household_grouping census_division
                                                          census_region
Length: 16997
                   Length: 16997
                                      Length: 16997
                                                          Length: 16997
```

Class :character Class :character Class :character Mode :character Mode :character Mode :character Mode :character Mode :character

DRIVER education_level ENDTRIP exit_census_division

Length:16997 Length:16997 Length:16997 Length:16997 Class:character Class:character Class:character Mode:character Mode:charac

farthest_census_division_traveled farthest_census_region_traveled

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

 ${\tt reason_for_travel \ \ great_circle_distance_longer_than_50_miles}$

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

household_income household_income_imputed hispanic
Length:16997 Length:16997 Length:16997
Class :character Class :character Class :character
Mode :character Mode :character Mode :character

race own_or_rent_home international_trip long_distance_trip

Length:16997 Length:16997 Length:16997 Length:16997 Class:character Class:character Class:character Mode:character Mode:charac

LIF_CYC main_mode_of_transport date_of_most_recent_trip

Length:16997 Length:16997 Length:16997 Class:character Class:character Class:character

Mode :character Mode :character Mode :character

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character

 $\verb|person_10_on_long_distance_trip| | person_2_on_long_distance_trip|$

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

person_3_on_long_distance_trip person_4_on_long_distance_trip

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

person_5_on_long_distance_trip person_6_on_long_distance_trip

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

person_7_on_long_distance_trip person_8_on_long_distance_trip

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

person_9_on_long_distance_trip proxy_respondent metro_rail_status
Length:16997 Length:16997 Length:16997
Class :character Class :character
Mode :character Mode :character Mode :character

respondent_hispanic respondent_race respondent_sex
Length:16997 Length:16997 Length:16997
Class :character Class :character
Mode :character Mode :character

 ${\tt respondent_sex_imputed\ travel_day_of_week\ household_urban_classification}$

Length:16997 Length:16997 Length:16997
Class:character Class:character Mode:character Mode:character Mode:character

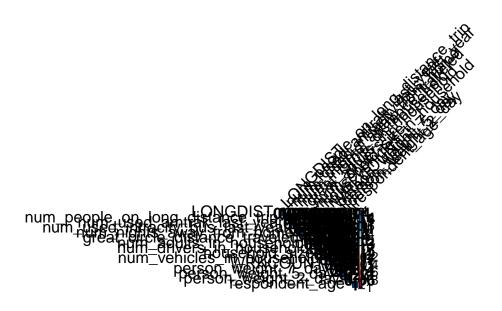
household_urban_size household_urban_rural trip_includes_weekend

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

worker_status
Length:16997
Class :character
Mode :character

```
# Corr plot
long_distance |>
    select(-household_id) |>
    select(where(is.numeric)) |>
    cor() |>
    corrplot::corrplot(
        method = "color",
        type = "upper",
        tl.col = "black",
        tl.srt = 45,
```

```
addCoef.col = "black",
)
```



Person Data

person |> glimpse()

```
Rows: 16,997
Columns: 129
                                                  <chr> "9000013002", "90000130~
$ household_id
                                                  <chr> "01", "02", "03", "04",~
$ person_id
$ person_weight_7_day
                                                  <dbl> 3938.689, 5409.515, 301~
                                                  <dbl> 0.000, 0.000, 0.000, 0.~
$ person_weight_5_day
$ person_weight_2_day
                                                  <dbl> 13363.809, 19360.095, 7~
                                                  <dbl> 39, 42, 8, 5, 32, 41, 4~
$ respondent_age
$ great_circle_distance_work
                                                  <dbl> -1.000000, -9.000000, -~
$ days_used_taxi_last_30
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
$ days_used_ride_share_last_30
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
$ days_used_scooter_last_30
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
$ days_used_public_transit_last_30
```

```
$ days_used_motorcycle_last_30
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
                                                  <dbl> 10, 3, -1, -1, 3, 4, 15~
$ days_walked_as_transit_last_30
$ days_cycled_last_30
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
$ days_used_bikeshare_last_30
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
$ hours worked per week
                                                  <dbl> -1, 55, -1, -1, 30, 40,~
$ num_online_deliveries_last_30
                                                  <dbl> 10, 12, -1, -1, 10, 10,~
$ num goods deliveries last 30
                                                  <dbl> 10, 12, -1, -1, 8, 8, 6~
                                                  <dbl> 0, 0, -1, -1, 2, 2, 4, ~
$ num_food_deliveries_last_30
$ num_grocery_deliveries_last_30
                                                  <dbl> 0, 0, -1, -1, -9, -9, 1~
$ num_services_deliveries_last_30
                                                  <dbl> 0, 0, -1, -1, -9, -9, -~
                                                  <dbl> 0, 0, -1, -1, -9, -9, -~
$ num_returned_home_pickup
$ num_returned_ups_usps_fedex
                                                  <dbl> 2, 2, -1, -1, -9, 3, -9~
                                                  <dbl> 1, 0, -1, -1, 2, -9, 1,~
$ num_returned_amazon_dropoff_center
                                                  <dbl> 2, 1, -1, -1, 1, -9, -9~
$ num_returned_store
                                                  <dbl> -1, -1, -1, -1, -1, -1, -
$ home_parking_cost
                                                  <dbl> 2, 3, 0, 2, 3, 3, 0, 2,~
$ count_person_trips
$ num_adults_in_household
                                                  <dbl> 2, 2, 2, 2, 2, 1, 2,~
$ num_drivers_in_household
                                                  <dbl> 2, 2, 2, 2, 2, 2, 1, 2,~
$ household_size
                                                  <dbl> 4, 4, 4, 4, 2, 2, 1, 4,~
$ num vehicles in household
                                                  <dbl> 2, 2, 2, 2, 1, 1, 0, 1,~
                                                  <chr> "202202", "202202", "20~
$ travel day date
$ WRKCOUNT
                                                  <dbl> 1, 1, 1, 1, 2, 2, 1, 1,~
$ household_stratum_id
                                                  <chr> "1021", "1021", "1021",~
                                                  <chr> "New England MSA/CMSA o~
$ household_grouping
$ census_division
                                                  <chr> "New England", "New Eng~
                                                  <chr> "Northeast", "Northeast~
$ census_region
                                                  <chr> "Valid skip", "Valid sk~
$ daytime_limit_driving
                                                  <chr> "Valid skip", "Valid sk~
$ unaffected_travel
                                                  <chr> "Valid skip", "Valid sk~
$ limited_transit_use
$ limited_transit_use_noresponse
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Valid skip", "Valid sk~
$ requested_rides
$ limited_driving
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Valid skip", "Valid sk~
$ requested_ride_shares
$ requires_special_transport
                                                  <chr> "Valid skip", "Valid sk~
$ reduce travel disability
                                                  <chr> "Valid skip", "Valid sk~
$ covid_online_delivery_impact
                                                  <chr> "Do the same as before"~
$ covid_public_transit_impact
                                                  <chr> "Do less often than bef~
$ covid_school_travel_impact
                                                  <chr> "Valid skip", "Valid sk~
$ covid_work_travel_impact
                                                  <chr> "Valid skip", "Do less ~
                                                  <chr> "Valid skip", "Valid sk~
$ covid_online_delivery_impact_permant
$ covid_public_transit_impact_permant
                                                  <chr> "Temporary", "Don't Kno~
$ covid_school_travel_impact_permant
                                                  <chr> "Valid skip", "Valid sk~
$ covid_work_travel_impact_permant
                                                  <chr> "Valid skip", "Permanen~
```

```
$ DRIVER
                                                  <chr> "Yes", "Yes", "Valid sk~
$ drive_for_work
                                                  <chr> "Valid skip", "No", "Va~
                                                  <chr> "Valid skip", "Valid sk~
$ DRIVINGVEHICLE
$ education_level
                                                  <chr> "Master's degree", "Mas~
$ employer_pays_transit
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Yes", "Yes", "Yes", "Y~
$ started_travel_at_home
$ household income
                                                  <chr> "$200,000 or more", "$2~
                                                  <chr> "$200,000 or more", "$2~
$ household_income_imputed
                                                  <chr> "Not Hispanic or Latino~
$ hispanic
                                                  <chr> "White", "White", "Whit~
$ race
                                                  <chr> "Owned by hh member wit~
$ own_or_rent_home
$ used_bike_last_30
                                                  <chr> "No", "No", "Valid skip~
$ used_bikeshare_last_30
                                                  <chr> "Valid skip", "Valid sk~
$ used_e_scooter_last_30
                                                  <chr> "No", "No", "Valid skip~
                                                  <chr> "No", "No", "Valid skip~
$ used_motorcycle_last_30
                                                  <chr> "No", "No", "Valid skip~
$ used_public_transit_last_30
                                                  <chr> "No", "No", "Valid skip~
$ used_ride_share_last_30
                                                  <chr> "No", "No", "Valid skip~
$ used_taxi_last_30
$ walked_last_30
                                                  <chr> "Yes", "Yes", "Valid sk~
$ LIF CYC
                                                  <chr> "2+ adults, youngest ch~
$ medical condition
                                                  <chr> "No", "No", "No", "No",~
$ medical condition duration
                                                  <chr> "Valid skip", "Valid sk~
$ metro_area_category
                                                  <chr> "MSA of 1 million or mo~
$ metro_area_size
                                                  <chr> "In an MSA or CMSA of 3~
$ away_entire_day
                                                  <chr> "No", "No", "No", "No",~
                                                  <chr> "No", "Valid skip", "Va~
$ paid_for_parking_travel_day
                                                  <chr> "Valid skip", "Valid sk~
$ pay_home_parking
                                                  <chr> "Valid skip", "Valid sk~
$ whether_pay_home_parking
                                                  <chr> "Valid skip", "Valid sk~
$ home_parking_payment_periodicity
$ worked_last_week
                                                  <chr> "No", "Yes", "Valid ski~
$ primary_activity_not_work
                                                  <chr> "A homemaker", "Valid s~
                                                  <chr> "Self", "Someone else",~
$ proxy_respondent
                                                  <chr> "No", "No", "No", "No",~
$ non_english_language_spoken
                                                  <chr> "Valid skip", "Valid sk~
$ how_well_english_spoken
$ metro rail status
                                                  <chr> "Yes", "Yes", "Yes", "Y~
                                                  <chr> "Not Hispanic", "Not Hi~
$ respondent_hispanic
$ respondent race
                                                  <chr> "White", "White", "Whit~
                                                  <chr> "White", "White", "Whit~
$ respondent_race_imputed
$ respondent_relationship
                                                  <chr> "Self", "Spouse/Partner~
                                                  <chr> "Female", "Male", "Refu~
$ respondent_sex
$ respondent_sex_imputed
                                                  <chr> "Female", "Male", "Male~
$ reason_no_travel
                                                  <chr> "Valid skip", "Valid sk~
```

<chr> "No", "No", "Yes", "Yes~

\$ enrolled_in_school

```
$ school_type_nontraditional
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Valid skip", "Valid sk~
$ school_transportation
                                                  <chr> "Valid skip", "Valid sk~
$ school_type
                                                  <chr> "Valid skip", "Valid sk~
$ school_program_description
                                                  <chr> "Sunday", "Sunday", "Su~
$ travel day of week
$ days_used_discounted_transit_last_30
                                                  <chr> "Valid skip", "Valid sk~
$ household urban classification
                                                  <chr> "In an urban area", "In~
$ household_urban_size
                                                  <chr> "1,000,000 or more with~
                                                  <chr> "Urban", "Urban", "Urba~
$ household urban rural
$ fewer_trips_last_30
                                                  <chr> "No, did not take fewer~
                                                  <chr> "Valid skip", "Valid sk~
$ fewer_trips_last_30_reason_more_deliveries
$ fewer_trips_last_30_reason_covid
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Valid skip", "Valid sk~
$ fewer_trips_last_30_reason_not_feel_safe
                                                  <chr> "Valid skip", "Valid sk~
$ fewer_trips_last_30_reason_not_feel_clean
                                                  <chr> "Valid skip", "Valid sk~
$ fewer_trips_last_30_reason_not_reliable
$ fewer_trips_last_30_reason_not_go_where_needed <chr>> "Valid skip", "Valid sk~
                                                  <chr> "valid skip", "valid sk~
$ fewer_trips_last_30_reason_unaffordable
                                                  <chr> "valid skip", "valid sk~
$ fewer_trips_last_30_reason_health
$ fewer_trips_last_30_reason_time
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Valid skip", "Valid sk~
$ fewer_trips_last_30_reason_other
$ USEPUBTR
                                                  <chr> "No", "No", "No", "No",~
                                                  <chr> "Valid skip", "Person1"~
$ who_completed_survey
$ days_per_week_work_from_home
                                                  <chr> "Valid skip", "Five or ~
                                                  <chr> "Not worker", "Worker",~
$ worker_status
$ work_location
                                                  <chr> "Valid skip", "Only one~
                                                  <chr> "Valid skip", "Valid sk~
$ work_transportation
                                                  <chr> "Valid skip", "Valid sk~
$ used_cane
                                                  <chr> "Valid skip", "Valid sk~
$ used_wheelchair
                                                  <chr> "Valid skip", "Valid sk~
$ no_assistance
$ used_blind_deaf_assistance
                                                  <chr> "Valid skip", "Valid sk~
                                                  <chr> "Valid skip", "Valid sk~
$ W_VISIMP
                                                  <chr> "Valid skip", "Valid sk~
$ used_walker_crutches
```

person |> summary()

household_id person_id person_weight_7_day person_weight_5_day Length: 16997 Length: 16997 30.9 Min. Min. : : Class : character Class : character 1st Qu.: 5614.8 1st Qu.: Mode :character Mode :character Median: 10798.7 Median: 9142 : 17977.3 : 17977 Mean Mean 3rd Qu.: 21084.0 3rd Qu.: 22271 Max. :781700.0 Max. :972351

```
great_circle_distance_work
person_weight_2_day respondent_age
Min. :
             0
                    Min.
                           : 5.00
                                    Min. : -9.000
1st Qu.:
             0
                    1st Qu.:28.00
                                    1st Qu.: -1.000
Median:
                    Median :48.00
                                    Median :
                                              -1.000
             0
Mean : 17977
                    Mean
                          :45.92
                                    Mean
                                                3.101
3rd Qu.: 11093
                    3rd Qu.:65.00
                                    3rd Qu.:
                                                2.717
Max.
       :473082
                    Max.
                           :92.00
                                    Max.
                                            :2543.954
days_used_taxi_last_30 days_used_ride_share_last_30 days_used_scooter_last_30
       :-1.0000
                       Min.
                              :-1.0000
                                                     Min.
                                                            :-1.0000
1st Qu.:-1.0000
                       1st Qu.:-1.0000
                                                     1st Qu.:-1.0000
Median :-1.0000
                       Median :-1.0000
                                                     Median :-1.0000
      :-0.8781
                       Mean
Mean
                              :-0.4042
                                                     Mean
                                                            :-0.9355
3rd Qu.:-1.0000
                       3rd Qu.:-1.0000
                                                     3rd Qu.:-1.0000
Max.
       :30.0000
                       Max.
                              :30.0000
                                                     Max.
                                                            :30.0000
days_used_public_transit_last_30 days_used_motorcycle_last_30
                                         :-1.0000
      :-1.0000
                                 Min.
                                 1st Qu.:-1.0000
1st Qu.:-1.0000
Median :-1.0000
                                 Median :-1.0000
Mean
       :-0.2196
                                 Mean
                                         :-0.8399
3rd Qu.:-1.0000
                                 3rd Qu.:-1.0000
                                         :30.0000
Max.
       :30.0000
                                 Max.
days walked as transit last 30 days cycled last 30 days used bikeshare last 30
       :-1.000
                               Min.
                                      :-1.0000
                                                    Min.
                                                          :-1.0000
1st Qu.:-1.000
                               1st Qu.:-1.0000
                                                    1st Qu.:-1.0000
Median :-1.000
                               Median :-1.0000
                                                    Median :-1.0000
      : 3.016
Mean
                               Mean
                                       :-0.3464
                                                    Mean
                                                           :-0.9715
3rd Qu.: 3.000
                               3rd Qu.:-1.0000
                                                    3rd Qu.:-1.0000
Max.
       :30.000
                               Max.
                                       :30.0000
                                                    Max.
                                                           :30.0000
hours_worked_per_week num_online_deliveries_last_30
       :-1.00
                      Min.
                             :-1.000
                      1st Qu.: 0.000
1st Qu.:-1.00
Median :-1.00
                      Median : 2.000
Mean
       :16.89
                      Mean
                             : 4.758
3rd Qu.:40.00
                      3rd Qu.: 6.000
                             :99.000
Max.
       :99.00
                      Max.
num_goods_deliveries_last_30 num_food_deliveries_last_30
      :-9.000
                             Min.
                                    :-9.000
1st Qu.:-1.000
                             1st Qu.:-9.000
Median : 2.000
                             Median :-1.000
Mean
     : 3.581
                             Mean
                                    :-2.213
3rd Qu.: 5.000
                             3rd Qu.: 0.000
       :99.000
                             Max.
                                     :59.000
Max.
num_grocery_deliveries_last_30 num_services_deliveries_last_30
```

```
Min.
       :-9.000
                                Min.
                                       :-9.000
1st Qu.:-9.000
                                1st Qu.:-9.000
Median :-1.000
                                Median :-1.000
Mean
       :-2.842
                                Mean
                                       :-3.033
3rd Qu.: 0.000
                                3rd Qu.: 0.000
Max.
       :30.000
                                Max.
                                       :60.000
num returned home pickup num returned ups usps fedex
Min.
       :-9.000
                          Min.
                                 :-9.00
1st Qu.:-1.000
                          1st Qu.:-1.00
Median :-1.000
                         Median: 0.00
       :-1.977
                                 :-1.31
Mean
                          Mean
3rd Qu.: 0.000
                          3rd Qu.: 0.00
Max.
       :60.000
                          Max.
                                 :47.00
num returned amazon dropoff center num returned store home parking cost
       :-9.000
                                    Min.
                                           :-9.000
                                                        Min.
                                                               : -1.0000
1st Qu.:-1.000
                                    1st Qu.:-1.000
                                                        1st Qu.: -1.0000
Median :-1.000
                                    Median :-1.000
                                                        Median : -1.0000
       :-1.779
Mean
                                    Mean
                                           :-1.922
                                                        Mean
                                                               : -0.9344
3rd Qu.: 0.000
                                    3rd Qu.: 0.000
                                                        3rd Qu.: -1.0000
Max.
       :31.000
                                    Max.
                                           :17.000
                                                        Max.
                                                               :200.0000
count person trips num adults in household num drivers in household
Min.
       : 0.000
                   Min.
                           :1.000
                                            Min.
                                                    :0.000
1st Qu.: 0.000
                   1st Qu.:2.000
                                            1st Qu.:2.000
Median : 2.000
                   Median :2.000
                                            Median :2.000
Mean
      : 1.828
                   Mean
                           :2.135
                                            Mean
                                                    :1.998
3rd Qu.: 3.000
                   3rd Qu.:2.000
                                            3rd Qu.:2.000
       :36.000
                   Max.
                           :8.000
                                                    :7.000
Max.
                                            Max.
household_size
                num_vehicles_in_household travel_day_date
                                                                  WRKCOUNT
       : 1.00
                Min.
                       : 0.000
                                           Length: 16997
Min.
                                                               Min.
                                                                      :0.000
1st Qu.: 2.00
                1st Qu.: 1.000
                                           Class : character
                                                               1st Qu.:0.000
Median: 2.00
                Median : 2.000
                                           Mode :character
                                                               Median :1.000
Mean
      : 2.91
                Mean
                       : 2.098
                                                               Mean
                                                                      :1.216
3rd Qu.: 4.00
                3rd Qu.: 3.000
                                                               3rd Qu.:2.000
Max.
       :10.00
                Max.
                        :17.000
                                                               Max.
                                                                      :6.000
household stratum id household grouping census division
                                                             census region
Length: 16997
                     Length: 16997
                                         Length: 16997
                                                             Length: 16997
Class : character
                     Class :character
                                         Class :character
                                                             Class :character
Mode :character
                     Mode :character
                                         Mode :character
                                                             Mode :character
```

daytime_limit_driving unaffected_travel limited_transit_use Length:16997 Length:16997 Length:16997

Class : character Class : character Mode : character Mode : character Mode : character

requested_ride_shares requires_special_transport reduce_travel_disability

Length:16997 Length:16997 Length:16997
Class :character Class :character Class :character
Mode :character Mode :character Mode :character

covid_online_delivery_impact covid_public_transit_impact

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

covid_school_travel_impact covid_work_travel_impact

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

 $\verb|covid_online_delivery_impact_permant| | covid_public_transit_impact_permant| \\$

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

covid_school_travel_impact_permant covid_work_travel_impact_permant

Length:16997 Length:16997 Class:character Class:character

DRIVER drive for work DRIVINGVEHICLE education level Length: 16997 Length: 16997 Length: 16997 Length: 16997 Class : character Class : character Class :character Class : character Mode :character Mode :character Mode :character Mode :character

household_income_imputed hispanic race
Length:16997 Length:16997 Length:16997
Class :character Class :character
Mode :character Mode :character Mode :character

own_or_rent_home used_bike_last_30 used_bikeshare_last_30

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

used_e_scooter_last_30 used_motorcycle_last_30 used_public_transit_last_30

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

used_ride_share_last_30used_taxi_last_30walked_last_30Length:16997Length:16997Length:16997Class :characterClass :characterClass :characterMode :characterMode :characterMode :character

LIF_CYC medical_condition medical_condition_duration

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character Mode:character Mode:character

metro_area_category metro_area_size away_entire_day
Length:16997 Length:16997 Length:16997
Class :character Class :character
Mode :character Mode :character Mode :character

paid_for_parking_travel_day pay_home_parking whether_pay_home_parking

Length:16997 Length:16997 Length:16997
Class:character Class:character Mode:character Mode:character Mode:character

home_parking_payment_periodicity_worked_last_week primary_activity_not_work

Length:16997 Length:16997 Length:16997
Class:character Class:character Mode:character Mode:character Mode:character

proxy_respondent non_english_language_spoken how_well_english_spoken

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

metro_rail_status respondent_hispanic respondent_race Length:16997 Length:16997 Length:16997 Class :character Class :character Class :character Mode :character Mode :character Mode :character respondent_sex_imputed reason_no_travel enrolled_in_school

Length:16997 Length:16997 Length:16997
Class:character Class:character Mode:character Mode:character

 ${\tt school_program_description\ travel_day_of_week}$

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

days_used_discounted_transit_last_30 household_urban_classification

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

household_urban_size household_urban_rural fewer_trips_last_30

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

 $fewer_trips_last_30_reason_more_deliveries\ fewer_trips_last_30_reason_covid$

Length:16997 Length:16997
Class :character Class :character
Mode :character Mode :character

fewer_trips_last_30_reason_not_feel_safe

Length:16997 Class :character Mode :character

 ${\tt fewer_trips_last_30_reason_not_feel_clean}$

Length:16997 Class :character Mode :character

fewer_trips_last_30_reason_not_reliable

Length:16997 Class :character Mode :character

fewer_trips_last_30_reason_not_go_where_needed

Length:16997 Class :character Mode :character

 $fewer_trips_last_30_reason_unaffordable\ fewer_trips_last_30_reason_health$

Length:16997 Length:16997
Class :character Class :character
Mode :character Mode :character

fewer_trips_last_30_reason_time fewer_trips_last_30_reason_other

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

USEPUBTR who_completed_survey days_per_week_work_from_home

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

worker_status work_location work_transportation used_cane
Length:16997 Length:16997 Length:16997 Length:16997
Class :character Class :character Class :character
Mode :character Mode :character Mode :character
Mode :character Mode :character

used_wheelchair no_assistance used_blind_deaf_assistance

Length:16997 Length:16997 Length:16997
Class:character Class:character Class:character
Mode:character Mode:character

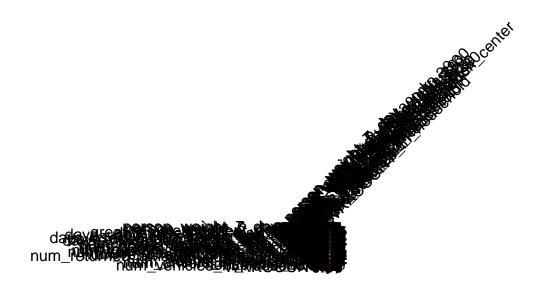
W_VISIMP used_walker_crutches

Length:16997 Length:16997
Class:character Class:character
Mode:character Mode:character

```
# Corr plot
person |>
    select(-household_id) |>
    select(where(is.numeric)) |>
    cor() |>
    corrplot::corrplot(
```

```
method = "color",
  type = "upper",
  tl.col = "black",
  tl.srt = 45,
  addCoef.col = "black",
)
```

Warning in corrplot::corrplot(cor(select(select(person, -household_id), : Not been able to calculate text margin, please try again with a clean new empty window using {plot.new(); dev.off()} or reduce tl.cex



Trip Data

```
trip |> glimpse()
```

```
<chr> "01", "02", "01", "02", "03", "01", ~
$ trip_id
                                    <chr> "01", "02", "01", "02", "03", "01", ~
$ sequential_trip_id
$ time_at_destination
                                    <dbl> 75, -9, 10, 10, -9, 75, -9, 260, 105~
$ trip_duration_minutes
                                    <dbl> 15, 10, 30, 10, 30, 15, 10, 10, 15, ~
                                    <dbl> 2, 2, 1, 1, 1, 2, 2, 2, 2, 2, 2, 2, ~
$ num people on trip
$ num_non_household_members_on_trip <dbl> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0
$ num household members on trip
                                    <chr> "02", "02", "01", "01", "01", "02", ~
                                    <dbl> -1, -1, -1, -1, -1, -1, -1, -1, -1, -
$ parking_cost
                                    <dbl> 3.9024239, 3.9024239, 17.0770665, 4.~
$ trip_miles
$ trip_weight_7_day
                                    <dbl> 1608362, 1608362, 2208973, 2208973, ~
                                    <dbl> 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 1~
$ trip_weight_5_day
                                    <dbl> 1569852, 1569852, 2274239, 2274239, ~
$ trip_weight_2_day
                                    <chr> "90000130020101", "90000130020102", ~
$ trip_case_id
                                    <dbl> 3.9024239, 3.9024239, 17.0770665, 4.~
$ vehicle_miles_traveled
                                    <chr> "355.1", "355.1", "355.1", "355.1", ~
$ gas_price_at_travel_time
                                    <dbl> 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, ~
$ num_adults_in_household
$ num_drivers_in_household
                                    <dbl> 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, 2, ~
$ household_size
                                    <dbl> 4, 4, 4, 4, 4, 4, 4, 2, 2, 2, 2, 2, ~
$ num_vehicles_in_household
                                    <dbl> 2, 2, 2, 2, 2, 2, 1, 1, 1, 1, 1, ~
                                    <chr> "202202", "202202", "202202", "20220~
$ travel day date
$ WRKCOUNT
                                    <dbl> 1, 1, 1, 1, 1, 1, 1, 2, 2, 2, 2, 2, ~
                                    <chr> "1021", "1021", "1021", "1021", "102~
$ household_stratum_id
$ respondent_age
                                    <dbl> 39, 39, 42, 42, 42, 5, 5, 32, 32, 32~
                                    <chr> "New England MSA/CMSA of 1 million+ ~
$ household_grouping
$ census_division
                                    <chr> "New England", "New England", "New E~
                                    <chr> "Northeast", "Northeast", "Northeast~
$ census_region
                                    <chr> "Yes", "Yes", "Yes", "Yes", "Yes", "~
$ DRIVER
                                    <chr> "Driver on trip", "Driver on trip", ~
$ driver_flag
                                    <chr> "Master's degree", "Master's degree"~
$ education_level
$ end_trip_time
                                    <chr> NA, NA, NA, NA, NA, NA, NA, NA, NA, ~
                                    <chr> "Yes", "Yes", "Yes", "Yes", "Yes", "~
$ started_travel_at_home
                                    <chr> "$200,000 or more", "$200,000 or mor~
$ household_income
$ household_income_imputed
                                    <chr> "$200,000 or more", "$200,000 or mor~
$ drove_on_trip
                                    <chr> "Household member drove", "Household~
                                    <chr> "Not Hispanic or Latino", "Not Hispa~
$ hispanic
                                    <chr> "White", "White", "White", ~
$ race
                                    <chr> "Owned by hh member with mortgage or~
$ own or rent home
$ LIF_CYC
                                    <chr> "2+ adults, youngest child 0-5", "2+~
                                    <chr> "Not a loop trip", "Not a loop trip"~
$ loop_trip
                                    <chr> "MSA of 1 million or more, with rail~
$ metro_area_category
                                    <chr> "In an MSA or CMSA of 3 million or m^{\sim}
$ metro_area_size
                                    <chr> "Selected", "Selected", "Not Selecte~
$ person_1_on_trip
$ person_10_on_trip
                                    <chr> "Valid skip", "Valid skip", "Valid s~
```

```
<chr> "Not Selected", "Not Selected", "Sel~
$ person_2_on_trip
                                                                 <chr> "Not Selected", "Not Selected", "Not~
$ person_3_on_trip
                                                                 <chr> "Selected", "Selected", "Not Selecte~
$ person_4_on_trip
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ person_5_on_trip
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ person 6 on trip
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ person_7_on_trip
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ person_8_on_trip
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ person_9_on_trip
                                                                 <chr> "No", "No", "Valid skip", "Valid ski~
$ paid_for_parking_travel_day
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ paid_for_parking_trip
                                                                 <chr> "Valid skip", "Valid skip", "Valid s~
$ parking_payment_periodicity
$ primary_activity_not_work
                                                                 <chr> "A homemaker", "A homemaker", "Valid~
                                                                 <chr> "Self", "Self", "Someone else", "Som~
$ proxy_respondent
                                                                 <chr> "Not passenger on trip", "Not passen~
$ PSGR_FLG
                                                                 <chr> "Did not use public transit", "Did n~
$ public_transit_used_on_trip
$ metro_rail_status
                                                                 <chr> "Yes", "Yes", "Yes", "Yes", "Yes", "~
$ respondent_hispanic
                                                                 <chr> "Not Hispanic", "Not Hispanic", "Not~
                                                                 <chr> "White", "White", "White", ~
$ respondent_race
$ respondent_sex
                                                                 <chr> "Female", "Female", "Male", "Male", ~
                                                                 <chr> "Female", "Female", "Male", "Male", ~
$ respondent sex imputed
$ start_trip_time
                                                                 <chr> NA, NA, NA, NA, NA, NA, NA, NA, NA, ~
                                                                 <chr> "Weekend", "Weekend", "Weekend", "We~
$ weekend trip
                                                                 <chr> "Sunday", "Sunday", "Sunday", "Sunda~
$ travel_day_of_week
$ trip purpose
                                                                 <chr> "Home-based social/recreational (HBS~
$ vehicle_used_on_trip
                                                                 <chr> "Yes, used a household vehicle", "Ye~
                                                                 <chr> "SUV/Crossover", "SUV/Crossover", "S~
$ trip_mode
                                                                 <chr> "In an urban area", "In an urban are~
$ household_urban_classification
$ household_urban_size
                                                                 <chr> "1,000,000 or more with heavy rail",~
$ household_urban_rural
                                                                 <chr> "Urban", "Urban", "Urban", "Urban", ~
$ vehicle_case_id
                                                                 <chr> NA, NA, NA, NA, NA, NA, NA, NA, NA, ~
                                                                 <chr> "", "", "", "", "", "", "", "", "", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"", ~"",
$ vehicle_id
$ vehicle_type
                                                                 <chr> "SUV (Santa Fe, Tahoe, Jeep, etc.)",~
$ minutes_walked_from_parking
                                                                 <chr> "1 to less than 5 minutes", "0 minut~
$ who_drove
                                                                 <chr> "Person 1", "Person 1", "Person 2", ~
$ who drove imputed
                                                                 <chr> "Person 1", "Person 1", "Person 2", ~
                                                                 <chr> "Regular activities at home", "Recre~
$ reason_for_travel
$ reason_for_travel_to
                                                                 <chr> "Recreational activities", "Regular ~
$ why_trip
                                                                 <chr> "Social/Recreational", "Home", "Meal~
$ trip_purpose_old_schema
                                                                 <chr> "Other Social/Recreational", "Other ~
$ worker_status
                                                                 <chr> "Not worker", "Not worker", "Worker"~
```

trip |> summary()

household_id

Length: 31074

person_id

Length: 31074

```
Class : character
                   Class : character
                                      Class : character
                                                          Class : character
Mode :character
                   Mode :character
                                      Mode :character
                                                          Mode :character
time_at_destination trip_duration_minutes num_people_on_trip
Min. : -9.00
                    Min. :
                              -9.00
                                          Min.
                                                  : 1.000
                                           1st Qu.: 1.000
1st Qu.:
          -9.00
                    1st Qu.:
                              10.00
          20.00
                              15.00
Median :
                    Median :
                                          Median : 1.000
Mean
      : 95.18
                    Mean
                              24.55
                                          Mean
                                                  : 1.997
3rd Qu.: 110.00
                    3rd Qu.:
                              30.00
                                          3rd Qu.: 2.000
Max.
       :1050.00
                    Max.
                           :1425.00
                                          Max.
                                                  :99.000
num non household members on trip num household members on trip
Min.
      : 0.0000
                                  Length: 31074
1st Qu.: 0.0000
                                  Class : character
Median : 0.0000
                                  Mode :character
Mean
      : 0.4141
3rd Qu.: 0.0000
Max.
       :98.0000
parking_cost
                     trip_miles
                                      trip_weight_7_day
                                                           trip_weight_5_day
                        : -9.000
Min.
      : -1.0000
                   Min.
                                      Min. :
                                                   33695
                                                           Min.
                                                                           0
1st Qu.: -1.0000
                   1st Qu.:
                              1.759
                                                2694005
                                                           1st Qu.:
                                                                           0
                                       1st Qu.:
Median : -1.0000
                   Median:
                              4.280
                                      Median :
                                                4919086
                                                           Median :
                                                                     3173995
Mean
       : -0.8029
                             13.965
                   Mean
                                      Mean
                                                8166137
                                                           Mean
                                                                     5815804
3rd Qu.: -1.0000
                   3rd Qu.:
                             10.422
                                      3rd Qu.:
                                                9468638
                                                           3rd Qu.:
                                                                     7071783
Max.
       :900.0000
                          :4859.477
                                      Max.
                                              :322721156
                                                           Max.
                                                                  :285950601
                   Max.
trip_weight_2_day
                   trip_case_id
                                      vehicle_miles_traveled
Min.
     :
               0
                   Length:31074
                                      Min.
                                              : -9.000
1st Qu.:
               0
                   Class : character
                                       1st Qu.: -1.000
Median:
                   Mode :character
                                      Median:
                                                  2.094
Mean
      : 2302368
                                      Mean
                                                  7.527
3rd Qu.: 797350
                                      3rd Qu.:
                                                  7.129
       :53643494
                                      Max.
                                              :1682.699
gas_price_at_travel_time num_adults_in_household num_drivers_in_household
                                :1.000
                                                         :0.000
Length: 31074
                         Min.
                                                  Min.
Class : character
                         1st Qu.:2.000
                                                  1st Qu.:2.000
Mode :character
                         Median :2.000
                                                  Median :2.000
                                :2.059
```

trip_id

Length: 31074

sequential_trip_id

Length: 31074

Mean

:1.993

Mean

3rd Qu.:2.000 3rd Qu.:2.000 Max. :8.000 Max. :7.000

household_size num_vehicles_in_household travel_day_date WRKCOUNT Min. : 1.000 Min. : 0.000 Length: 31074 Min. :0.000 Class :character 1st Qu.: 2.000 1st Qu.: 1.000 1st Qu.:1.000 Median : 2.000 Median : 2.000 Mode :character Median :1.000 Mean : 2.822 Mean : 2.134 Mean :1.304 3rd Qu.: 4.000 3rd Qu.: 3.000 3rd Qu.:2.000 :10.000 Max. Max. :6.000 :11.000

household_stratum_id respondent_age household_grouping census_division
Length:31074 Min. : 5.0 Length:31074 Length:31074
Class :character 1st Qu.:32.0 Class :character Class :character
Mode :character Median :49.0 Mode :character Mode :character

Mean :46.8 3rd Qu.:64.0 Max. :92.0

census_region DRIVER driver_flag education_level Length:31074 Length: 31074 Length:31074 Length: 31074 Class :character Class : character Class : character Class : character Mode :character Mode :character Mode :character Mode :character

household_income_imputed drove_on_trip hispanic
Length:31074 Length:31074 Length:31074
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

own_or_rent_home LIF_CYC loop_trip race Length:31074 Length:31074 Length:31074 Length: 31074 Class : character Class : character Class : character Class : character Mode :character Mode :character Mode :character Mode :character person_2_on_trip person_3_on_trip person_4_on_trip person_5_on_trip Length:31074 Length: 31074 Length:31074 Length: 31074 Class :character Class : character Class : character Class : character Mode :character Mode :character Mode :character Mode :character

person_6_on_trip person_7_on_trip person_8_on_trip person_9_on_trip Length:31074 Length:31074 Length:31074 Length: 31074 Class :character Class : character Class : character Class :character Mode :character Mode :character Mode :character Mode : character

paid_for_parking_travel_day paid_for_parking_trip parking_payment_periodicity

Length:31074 Length:31074 Length:31074 Class:character Class:character Mode:character Mode:character Mode:character

primary_activity_not_work proxy_respondent PSGR_FLG
Length:31074 Length:31074 Length:31074
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

public_transit_used_on_trip metro_rail_status respondent_hispanic

Length:31074 Length:31074 Length:31074 Class:character Class:character Mode:character Mode:character Mode:character

respondent_race respondent_sex respondent_sex_imputed

Length:31074 Length:31074 Length:31074
Class:character Class:character Class:character Mode:character Mode:character

 ${\tt vehicle_used_on_trip_trip_mode} \qquad \qquad {\tt household_urban_classification}$

Length:31074 Length:31074 Length:31074 Class:character Class:character Mode:character Mode:character Mode:character

household_urban_size household_urban_rural vehicle_case_id Length:31074 Length:31074 Length:31074 Class :character Class :character Class :character Mode :character Mode :character Mode :character

vehicle_id vehicle_type minutes_walked_from_parking

Length:31074 Length:31074 Length:31074
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

who_drove who_drove_imputed reason_for_travel reason_for_travel_to

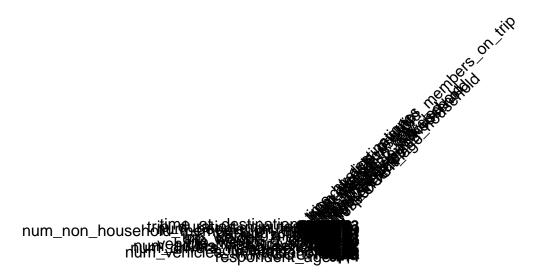
Length:31074 Length:31074 Length:31074 Length:31074
Class:character Class:character Class:character Mode:character Mode:charac

why_trip trip_purpose_old_schema worker_status

Length:31074 Length:31074 Length:31074
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

```
# Corr plot
trip |>
    select(-household_id) |>
    select(where(is.numeric)) |>
    cor() |>
    ## ggplot style
    corrplot::corrplot(
        method = "color",
        type = "upper",
        tl.col = "black",
        tl.srt = 45,
        addCoef.col = "black",
    )
```

Warning in corrplot::corrplot(cor(select(select(trip, -household_id), where(is.numeric))), : Not been able to calculate text margin, please try again with a clean new empty window using {plot.new(); dev.off()} or reduce tl.cex



Vehicle Data

vehicle |> glimpse()

```
Rows: 14,684
Columns: 47
                                        <chr> "9000013002", "9000013002", "900~
$ household_id
$ vehicle_id
                                        <chr> "01", "02", "01", "01", "01", "0~
                                        <dbl> 2015, 2019, 2011, 2015, 2014, 20~
$ vehicle_year
                                        <dbl> 2, 2, 1, 1, 1, 2, 2, 1, 2, 2, 1,~
$ num_vehicles_in_household
                                        <chr> "900001300201", "900001300202", ~
$ vehicle_case_id
$ annual_miles
                                        <dbl> 2000, 10000, 10000, 5000, 5000, ~
$ vehicle age
                                        <dbl> 7, 3, 11, 7, 8, 5, 22, 8, 13, 5,~
                                        <dbl> 2, 2, 2, 2, 1, 2, 2, 1, 2, 2, 2,~
$ num_adults_in_household
$ num_drivers_in_household
                                        <dbl> 2, 2, 2, 2, 1, 2, 2, 1, 2, 2, 1,~
$ household_size
                                        <dbl> 4, 4, 2, 4, 1, 3, 3, 1, 2, 2, 2,~
$ travel_day_date
                                        <chr> "202202", "202202", "202202", "2~
$ WRKCOUNT
                                        <dbl> 1, 1, 2, 1, 1, 2, 2, 0, 2, 2, 2,~
                                        <chr> "1021", "1021", "1021", "1021", ~
$ household_stratum_id
                                        <dbl> 4621.758, 4621.758, 2982.998, 10~
$ household_weight_7_day
$ household_weight_5_day
                                        <dbl> 0.000, 0.000, 3878.814, 13150.67~
```

```
$ household_weight_2_day
                                        <dbl> 13946.19, 13946.19, 0.00, 0.00, ~
                                        <chr> "New England MSA/CMSA of 1 milli~
$ household_grouping
$ census_division
                                        <chr> "New England", "New England", "N~
$ census_region
                                        <chr> "Northeast", "Northeast", "North~
                                        <chr> "Appropriate skip", "Appropriate~
$ commercial frequency of veh last 30
                                         <chr> "$200,000 or more", "$200,000 or~
$ household_income
$ household_income_imputed
                                         <chr> "$200,000 or more", "$200,000 or~
                                        <chr> "Appropriate skip", "Appropriate~
$ days_vehicle_used_deliveries_last_30
$ days_vehicle_used_other_last_30
                                         <chr> "Appropriate skip", "Appropriate~
$ days_vehicle_used_ride_shares_last_30 <chr>> "Appropriate skip", "Appropriate~
                                         <chr> "Not Hispanic or Latino", "Not H~
$ hispanic
                                         <chr> "White", "White", "White", "Whit~
$ race
$ own_or_rent_home
                                         <chr> "Owned by hh member with mortgag~
                                         <chr> "No", "No", "No", "No", "No", "N~
$ hybrid_vehicle
$ LIF_CYC
                                        <chr> "2+ adults, youngest child 0-5",~
                                        <chr> "Subaru", "Subaru", "Toyota", "N~
$ vehicle_make
$ metro_area_category
                                        <chr> "MSA of 1 million or more, with ~
$ metro_area_size
                                        <chr> "In an MSA or CMSA of 3 million ~
                                        <chr> "Yes", "Yes", "No", "Yes", "No",~
$ metro_rail_status
$ travel_day_of_week
                                        <chr> "Sunday", "Sunday", "Wednesday",~
$ household_urban_classification
                                        <chr> "In an urban area", "In an urban~
                                         <chr> "1,000,000 or more with heavy ra~
$ household_urban_size
$ household_urban_rural
                                         <chr> "Urban", "Urban", "Urban", "Urba~
                                        <chr> "No", "No", "No", "No", "No", "N~
$ vehicle_used_for_commercial_purposes
                                        <chr> "Valid skip", "Valid skip", "Val~
$ vehicle_used_for_deliveries
                                        <chr> "Valid skip", "Valid skip", "Val~
$ vehicle_used_for_other
                                         <chr> "Valid skip", "Valid skip", "Val~
$ vehicle_used_for_ride_shares
                                         <chr> "Gas", "Gas", "Gas", "Gas", "Gas~
$ vehicle_fuel_type
                                        <chr> "Yes", "Yes", "Yes", "Yes", "Yes"
$ vehicle_owned_more_1_year
$ vehicle_owned_months
                                        <chr> "Appropriate skip", "Appropriate~
                                         <chr> "SUV (Santa Fe, Tahoe, Jeep, etc~
$ vehicle_type
$ main_driver
                                         <chr> "Person1", "Person 2", "Person1"~
```

vehicle |> summary()

household_id	vehicle_id	vehicle_year	num_vehicles_in_household								
Length:14684	Length: 14684	Min. :1982	Min. : 1.000								
Class :character	Class :character	1st Qu.:2007	1st Qu.: 2.000								
Mode :character	Mode :character	Median :2014	Median : 2.000								
		Mean :2012	Mean : 2.534								
		3rd Qu.:2018	3rd Qu.: 3.000								
		Max. :2023	Max. :17.000								

```
vehicle_case_id
                   annual_miles
                                   vehicle_age
                                                   num_adults_in_household
Length: 14684
                  Min. :
                              -9
                                   Min.
                                          : 1.00 Min.
                                                          :1.000
Class : character
                  1st Qu.: 2000
                                   1st Qu.: 4.00
                                                   1st Qu.:2.000
Mode :character
                  Median: 6000
                                   Median: 8.00
                                                   Median :2.000
                  Mean : 12821
                                   Mean
                                         :10.17
                                                   Mean
                                                          :2.061
                   3rd Qu.: 12000
                                   3rd Qu.:15.00
                                                   3rd Qu.:2.000
                  Max.
                         :200000
                                   Max.
                                          :40.00
                                                   Max.
                                                          :8.000
num_drivers_in_household household_size
                                         travel_day_date
                                                               WRKCOUNT
       :0.000
                              : 1.000
                                         Length: 14684
Min.
                        Min.
                                                            Min.
                                                                   :0.000
1st Qu.:2.000
                        1st Qu.: 2.000
                                         Class : character
                                                            1st Qu.:0.000
Median :2.000
                        Median : 2.000
                                         Mode :character
                                                            Median :1.000
                        Mean : 2.558
Mean
       :2.014
                                                            Mean
                                                                   :1.179
                        3rd Qu.: 3.000
3rd Qu.:2.000
                                                            3rd Qu.:2.000
                                                                   :6.000
Max.
       :7.000
                        Max.
                                :10.000
                                                            Max.
household_stratum_id household_weight_7_day household_weight_5_day
Length: 14684
                    Min.
                           : 100.8
                                           Min.
                                                  :
Class : character
                     1st Qu.: 6611.2
                                           1st Qu.:
Mode :character
                    Median :11437.4
                                           Median : 10593
                    Mean
                           :15856.5
                                           Mean
                                                  : 15821
                     3rd Qu.:20122.9
                                           3rd Qu.: 22007
                    Max.
                           :81832.0
                                           Max.
                                                  :112970
household weight 2 day household grouping census division
Min.
     :
             0
                      Length: 14684
                                         Length: 14684
1st Qu.:
             0
                      Class : character
                                         Class : character
Median :
             0
                      Mode :character
                                         Mode :character
      : 15955
Mean
3rd Qu.: 15189
Max.
       :264588
census_region
                   commercial_frequency_of_veh_last_30 household_income
Length: 14684
                  Length: 14684
                                                      Length: 14684
Class :character
                  Class :character
                                                      Class : character
Mode :character
                  Mode :character
                                                      Mode :character
```

household_income_imputed days_vehicle_used_deliveries_last_30

Length:14684 Length:14684
Class:character Class:character
Mode:character Mode:character

days_vehicle_used_other_last_30 days_vehicle_used_ride_shares_last_30

Length:14684 Length:14684
Class:character Class:character
Mode:character Mode:character

hispanic race own_or_rent_home hybrid_vehicle
Length:14684 Length:14684 Length:14684 Length:14684
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

LIF_CYC vehicle_make metro_area_category metro_area_size
Length:14684 Length:14684 Length:14684 Length:14684
Class :character Class :character Class :character
Mode :character Mode :character Mode :character Mode :character

metro_rail_status travel_day_of_week household_urban_classification

Length:14684 Length:14684 Length:14684
Class:character Class:character Class:character
Mode:character Mode:character Mode:character

household_urban_size household_urban_rural

Length:14684 Length:14684
Class:character Class:character
Mode:character Mode:character

vehicle_used_for_commercial_purposes vehicle_used_for_deliveries

Length:14684 Length:14684
Class:character Class:character
Mode:character Mode:character

Class :character Class :character Class :character Mode :character Mode :character Mode :character

vehicle_owned_more_1_yearvehicle_owned_monthsvehicle_typeLength:14684Length:14684Length:14684Class :characterClass :characterClass :characterMode :characterMode :characterMode :character

main_driver
Length:14684
Class :character
Mode :character

```
# Corr plot
vehicle |>
    select(-household_id) |>
    select(where(is.numeric)) |>
    cor() |>
    corrplot::corrplot(
        method = "color",
        type = "upper",
        tl.col = "black",
        tl.srt = 45,
        addCoef.col = "black",
    )
```

