cause-analysis-casestudy-kuntal-k

October 14, 2024

```
[7]: # Import libraries
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from scipy.stats import norm
import warnings
warnings.filterwarnings('ignore')
```

1 Data Observation

```
[9]: # Loading the dataset
    dt = pd.read_csv("https://d2beiqkhq929f0.cloudfront.net/public_assets/assets/
      ⇔000/001/551/original/delhivery_data.csv?1642751181")
    dt.head(3)
[9]:
           data
                         trip_creation_time \
    0 training 2018-09-20 02:35:36.476840
    1 training 2018-09-20 02:35:36.476840
    2 training 2018-09-20 02:35:36.476840
                                     route_schedule_uuid route_type \
    0 thanos::sroute:eb7bfc78-b351-4c0e-a951-fa3d5c3...
                                                          Carting
    1 thanos::sroute:eb7bfc78-b351-4c0e-a951-fa3d5c3...
                                                          Carting
    2 thanos::sroute:eb7bfc78-b351-4c0e-a951-fa3d5c3...
                                                          Carting
                                                             source_name
                     trip_uuid source_center
    0 trip-153741093647649320 IND388121AAA Anand_VUNagar_DC (Gujarat)
    1 trip-153741093647649320 IND388121AAA Anand_VUNagar_DC (Gujarat)
    2 trip-153741093647649320 IND388121AAA Anand_VUNagar_DC (Gujarat)
                                       destination_name \
      destination_center
            IND388620AAB Khambhat MotvdDPP D (Gujarat)
    0
    1
            IND388620AAB Khambhat_MotvdDPP_D (Gujarat)
            IND388620AAB Khambhat_MotvdDPP_D (Gujarat)
```

```
cutoff_timestamp \
                      od_start_time ...
      0 2018-09-20 03:21:32.418600
                                               2018-09-20 04:27:55
      1 2018-09-20 03:21:32.418600 ...
                                               2018-09-20 04:17:55
      2 2018-09-20 03:21:32.418600 ...
                                        2018-09-20 04:01:19.505586
        actual_distance_to_destination actual_time osrm_time osrm_distance \
                                                                      11.9653
      0
                              10.435660
                                                14.0
                                                           11.0
                                                           20.0
      1
                              18.936842
                                                24.0
                                                                      21.7243
      2
                              27.637279
                                                40.0
                                                           28.0
                                                                      32.5395
                   segment_actual_time segment_osrm_time segment_osrm_distance \
      0 1.272727
                                  14.0
                                                     11.0
                                                                         11.9653
      1 1.200000
                                  10.0
                                                      9.0
                                                                          9.7590
                                                      7.0
      2 1.428571
                                  16.0
                                                                         10.8152
        segment_factor
      0
               1.272727
      1
               1.111111
               2.285714
      [3 rows x 24 columns]
[10]: # getting the counts of rows and columns in the dataset
      dt.shape
[10]: (144867, 24)
[11]: # getting the information of the dataset
      dt.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 144867 entries, 0 to 144866
     Data columns (total 24 columns):
      #
          Column
                                          Non-Null Count
                                                           Dtype
          _____
      0
                                          144867 non-null object
          data
                                          144867 non-null object
      1
          trip_creation_time
      2
          route_schedule_uuid
                                          144867 non-null object
      3
          route_type
                                          144867 non-null object
          trip_uuid
                                          144867 non-null object
                                          144867 non-null object
      5
          source_center
      6
          source_name
                                          144574 non-null object
      7
          destination center
                                          144867 non-null object
          destination_name
                                          144606 non-null object
      9
          od start time
                                          144867 non-null object
      10
          od_end_time
                                          144867 non-null object
```

144867 non-null float64

start_scan_to_end_scan

```
12 is_cutoff
                                    144867 non-null
                                                     bool
13
   cutoff_factor
                                    144867 non-null
                                                     int64
                                    144867 non-null
14
   cutoff_timestamp
                                                     object
   actual_distance_to_destination
                                    144867 non-null float64
16
   actual time
                                    144867 non-null float64
   osrm time
                                    144867 non-null float64
17
   osrm distance
                                    144867 non-null float64
19
   factor
                                    144867 non-null float64
                                    144867 non-null float64
   segment_actual_time
21
   segment_osrm_time
                                    144867 non-null float64
22
   segment_osrm_distance
                                    144867 non-null float64
   segment_factor
                                    144867 non-null
                                                     float64
```

dtypes: bool(1), float64(10), int64(1), object(12)

memory usage: 25.6+ MB

2 Column Profiling:

data - tells whether the data is testing or training data

trip_creation_time - Timestamp of trip creation

route_schedule_uuid - Unique Id for a particular route schedule

route_type - Transportation type

FTL – Full Truck Load: FTL shipments get to the destination sooner, as the truck is making no other pickups or drop-offs along the way Carting: Handling system consisting of small vehicles (carts)

trip_uuid - Unique ID given to a particular trip (A trip may include different source and destination centers)

source_center - Source ID of trip origin

source name - Source Name of trip origin

destination cente - Destination ID

destination name – Destination Name

od_start_time - Trip start time

od end time – Trip end time

start_scan_to_end_scan - Time taken to deliver from source to destination

is cutoff - Unknown field

cutoff_factor - Unknown field

cutoff timestamp - Unknown field

actual_distance_to_destination - Distance in Kms between source and destination warehouse actual_time - Actual time taken to complete the delivery (Cumulative)

osrm_time – An open-source routing engine time calculator which computes the shortest path between points in a given map (Includes usual traffic, distance through major and minor roads) and gives the time (Cumulative)

osrm_distance – An open-source routing engine which computes the shortest path between points in a given map (Includes usual traffic, distance through major and minor roads) (Cumulative)

factor - Unknown field

segment_actual_time – This is a segment time. Time taken by the subset of the package delivery

segment_osrm_time – This is the OSRM segment time. Time taken by the subset of the pack-

age delivery

segment_osrm_distance – This is the OSRM distance. Distance covered by subset of the package delivery

segment_factor - Unknown field

```
[12]: # checking for null values dt.isnull().sum()
```

[12]:	data	0
	trip_creation_time	0
	route_schedule_uuid	0
	route_type	0
	trip_uuid	0
	source_center	0
	source_name	293
	destination_center	0
	destination_name	261
	od_start_time	0
	od_end_time	0
	start_scan_to_end_scan	0
	is_cutoff	0
	cutoff_factor	0
	cutoff_timestamp	0
	actual_distance_to_destination	0
	actual_time	0
	osrm_time	0
	osrm_distance	0
	factor	0
	segment_actual_time	0
	segment_osrm_time	0
	segment_osrm_distance	0
	segment_factor	0
	dtype: int64	

We can see that null values are present in source_name and destination_name column

```
[13]: # Removing rows if any null values are present
data = dt.dropna(how = 'any')
```

- [14]: # getting the rows and column no. of original table dt.shape
- [14]: (144867, 24)
- [15]: # getting the rows and column no. of new table after removing null values rows data.shape

```
[15]: (144316, 24)
[16]: # chcking the null values of nuw tables
      data.isnull().sum()
                                         0
[16]: data
                                         0
      trip_creation_time
      route_schedule_uuid
                                         0
      route_type
                                         0
      trip_uuid
                                         0
      source_center
                                         0
      source_name
                                         0
                                         0
      destination_center
      destination_name
                                         0
      od_start_time
                                         0
      od_end_time
                                         0
      start_scan_to_end_scan
                                         0
      is_cutoff
      cutoff_factor
                                         0
                                         0
      cutoff_timestamp
      actual_distance_to_destination
                                         0
      actual_time
                                         0
                                         0
      osrm_time
                                         0
      osrm_distance
      factor
                                         0
                                         0
      segment_actual_time
      segment_osrm_time
                                         0
      segment_osrm_distance
                                         0
                                         0
      segment_factor
      dtype: int64
[17]: # no of unique values in each column of new table
      for i in data.columns:
        print(i,data[i].nunique())
     data 2
     trip_creation_time 14787
     route_schedule_uuid 1497
     route_type 2
     trip_uuid 14787
     source_center 1496
     source_name 1496
     destination_center 1466
     destination_name 1466
     od_start_time 26223
     od_end_time 26223
```

start_scan_to_end_scan 1914

```
is_cutoff 2
     cutoff_factor 501
     cutoff_timestamp 92894
     actual_distance_to_destination 143965
     actual time 3182
     osrm_time 1531
     osrm distance 137544
     factor 45588
     segment_actual_time 746
     segment_osrm_time 214
     segment_osrm_distance 113497
     segment_factor 5663
[18]: # coverting the object dtype time columns into pandas datetime dtype
      data['od_start_time'] = pd.to_datetime(data['od_start_time'])
      data['od_end_time'] = pd.to_datetime(data['od_end_time'])
      data['trip creation time'] = pd.to_datetime(data['trip creation time'])
[19]: # checking datatypes of new table
      data.dtypes
[19]: data
                                                 object
      trip_creation_time
                                         datetime64[ns]
      route_schedule_uuid
                                                 object
      route_type
                                                 object
                                                 object
      trip_uuid
                                                 object
      source_center
      source_name
                                                 object
      destination_center
                                                 object
      destination_name
                                                 object
                                         datetime64[ns]
      od_start_time
                                         datetime64[ns]
      od end time
      start_scan_to_end_scan
                                                float64
      is_cutoff
                                                   bool
      cutoff_factor
                                                  int64
      cutoff_timestamp
                                                 object
      actual_distance_to_destination
                                                float64
      actual_time
                                                float64
      osrm_time
                                                float64
      osrm_distance
                                                float64
      factor
                                                float64
      segment_actual_time
                                                float64
      segment_osrm_time
                                                float64
      segment_osrm_distance
                                                float64
      segment_factor
                                                float64
      dtype: object
```

```
[20]: # Get the unique values of the 'data' column
      unique_data = data['data'].unique()
      unique_data
[20]: array(['training', 'test'], dtype=object)
[21]: # Get the unique values of the 'route type' column
      unique_route_type = data['route_type'].unique()
      unique_route_type
[21]: array(['Carting', 'FTL'], dtype=object)
[22]: # creating a new new col by merging 3 columns
      data['segment_key'] =data['trip_uuid'] + data['source_center'] +__

¬data['destination_center']

      data['segment_key'].head(3)
[22]: 0
           trip-153741093647649320IND388121AAAIND388620AAB
           trip-153741093647649320IND388121AAAIND388620AAB
      1
           trip-153741093647649320IND388121AAAIND388620AAB
      Name: segment_key, dtype: object
[23]: # creating a df segment_col of 3 columns
      segment_col =_
       →['segment_actual_time','segment_osrm_time','segment_osrm_distance']
      data[segment col].head()
[23]:
         segment_actual_time segment_osrm_time segment_osrm_distance
                        14.0
                                           11.0
                                                                11.9653
      0
                        10.0
                                            9.0
                                                                 9.7590
      1
      2
                        16.0
                                            7.0
                                                                10.8152
                        21.0
                                           12.0
      3
                                                                13.0224
      4
                         6.0
                                            5.0
                                                                 3.9153
[24]: # Grouping by the segment_key of sub-journey in the trip
      for i in segment_col:
        data[i+'_sum'] = data.groupby('segment_key')[i].cumsum()
      segment_col_sum = [i+'_sum' for i in segment_col]
      data[segment_col_sum].head()
[24]:
         segment_actual_time_sum segment_osrm_time_sum segment_osrm_distance_sum
      0
                            14.0
                                                    11.0
                                                                            11.9653
                            24.0
      1
                                                    20.0
                                                                            21.7243
                                                    27.0
      2
                            40.0
                                                                            32.5395
      3
                            61.0
                                                    39.0
                                                                            45.5619
                            67.0
                                                    44.0
                                                                            49.4772
```

```
[25]: # creating a dictionary of 19 columns for aggreating at sub sourney level
     'trip_uuid' : 'first', 'source_center' : 'first', 'source_name' : __
      'destination_name' : 'last', 'od_start_time' : 'first', u
      'actual_distance_to_destination' : 'last', 'actual_time' : 'last', u
      'segment_actual_time_sum' : 'last', 'segment_osrm_distance_sum' : __
      agg dict
[25]: {'data': 'first',
     'trip_creation_time': 'first',
     'route_schedule_uuid': 'first',
     'route_type': 'first',
     'trip uuid': 'first',
     'source_center': 'first',
     'source name': 'first',
     'destination_center': 'last',
     'destination name': 'last',
     'od_start_time': 'first',
     'od_end_time': 'first',
     'start_scan_to_end_scan': 'first',
     'actual_distance_to_destination': 'last',
     'actual_time': 'last',
     'osrm_time': 'last',
     'osrm_distance': 'last',
     'segment_actual_time_sum': 'last',
     'segment_osrm_distance_sum': 'last',
     'segment_osrm_time_sum': 'last'}
[26]: | segment = data.groupby('segment_key').agg(agg_dict).reset_index()
     segment.head()
[26]:
                                                   data \
                                     segment_key
     0 trip-153671041653548748IND209304AAAIND000000ACB training
     1 trip-153671041653548748IND462022AAAIND209304AAA
                                                training
     2 trip-153671042288605164IND561203AABIND562101AAA
                                                training
     3 trip-153671042288605164IND572101AAAIND561203AAB
                                                training
     4 trip-153671043369099517IND000000ACBIND160002AAC
                                               training
             trip creation time \
     0 2018-09-12 00:00:16.535741
     1 2018-09-12 00:00:16.535741
     2 2018-09-12 00:00:22.886430
```

```
3 2018-09-12 00:00:22.886430
4 2018-09-12 00:00:33.691250
                                  route_schedule_uuid route_type
   thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                            FTL
  thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                            FTI.
  thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                        Carting
  thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                        Carting
4 thanos::sroute:de5e208e-7641-45e6-8100-4d9fb1e...
                                                            FTL
                 trip uuid source center
                                                                   source name
 trip-153671041653548748
                            IND209304AAA
                                           Kanpur_Central_H_6 (Uttar Pradesh)
1 trip-153671041653548748
                            IND462022AAA
                                           Bhopal_Trnsport_H (Madhya Pradesh)
2 trip-153671042288605164
                            IND561203AAB
                                            Doddablpur_ChikaDPP_D (Karnataka)
3 trip-153671042288605164
                            IND572101AAA
                                                 Tumkur_Veersagr_I (Karnataka)
4 trip-153671043369099517
                            INDO0000ACB
                                                Gurgaon_Bilaspur_HB (Haryana)
  destination_center
                                         destination_name
0
        INDO0000ACB
                            Gurgaon_Bilaspur_HB (Haryana)
        IND209304AAA
                      Kanpur_Central_H_6 (Uttar Pradesh)
1
2
        IND562101AAA
                       Chikblapur_ShntiSgr_D (Karnataka)
                       Doddablpur_ChikaDPP_D (Karnataka)
3
        IND561203AAB
        IND160002AAC
                           Chandigarh_Mehmdpur_H (Punjab)
               od start time
                                             od end time
0 2018-09-12 16:39:46.858469 2018-09-13 13:40:23.123744
1 2018-09-12 00:00:16.535741 2018-09-12 16:39:46.858469
2 2018-09-12 02:03:09.655591 2018-09-12 03:01:59.598855
3 2018-09-12 00:00:22.886430 2018-09-12 02:03:09.655591
4 2018-09-14 03:40:17.106733 2018-09-14 17:34:55.442454
                           actual_distance_to_destination
   start_scan_to_end_scan
                                                             actual_time
0
                   1260.0
                                                 383.759164
                                                                   732.0
1
                    999.0
                                                 440.973689
                                                                   830.0
2
                     58.0
                                                 24.644021
                                                                    47.0
3
                    122.0
                                                 48.542890
                                                                    96.0
4
                    834.0
                                                 237.439610
                                                                   611.0
              osrm distance
                              segment actual time sum
   osrm time
0
       329.0
                   446.5496
                                                 728.0
       388.0
                                                 820.0
1
                   544.8027
2
        26.0
                    28.1994
                                                 46.0
        42.0
3
                    56.9116
                                                 95.0
4
       212.0
                   281.2109
                                                 608.0
   segment_osrm_distance_sum
                               segment_osrm_time_sum
```

534.0

670.6205

0

```
1
                          649.8528
                                                    474.0
      2
                                                     26.0
                           28.1995
      3
                           55.9899
                                                     39.0
      4
                          317.7408
                                                    231.0
[27]: #Groupby mini-trips, sorting by time
      segment = segment.sort_values(by=['segment_key','od_end_time'],__
       →ascending=True).reset_index()
      segment.head(3)
[27]:
         index
                                                    segment_key
                                                                      data \
             0 trip-153671041653548748IND209304AAAIND000000ACB training
      1
             1 trip-153671041653548748IND462022AAAIND209304AAA
                                                                 training
      2
             2 trip-153671042288605164IND561203AABIND562101AAA training
                trip_creation_time
      0 2018-09-12 00:00:16.535741
      1 2018-09-12 00:00:16.535741
      2 2018-09-12 00:00:22.886430
                                       route_schedule_uuid route_type \
      0 thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                                FTL
      1 thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                                FTL
      2 thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                            Carting
                       trip_uuid source_center
                                                                        source name \
      0 trip-153671041653548748 IND209304AAA Kanpur_Central_H_6 (Uttar Pradesh)
      1 trip-153671041653548748 IND462022AAA Bhopal_Trnsport_H (Madhya Pradesh)
      2 trip-153671042288605164 IND561203AAB
                                                 Doddablpur_ChikaDPP_D (Karnataka)
        destination center
                                           od start time \
      0
              IND000000ACB ... 2018-09-12 16:39:46.858469
              IND209304AAA ... 2018-09-12 00:00:16.535741
      1
              IND562101AAA ... 2018-09-12 02:03:09.655591
                       od_end_time start_scan_to_end_scan
      0 2018-09-13 13:40:23.123744
                                                   1260.0
      1 2018-09-12 16:39:46.858469
                                                    999.0
      2 2018-09-12 03:01:59.598855
                                                     58.0
         actual_distance_to_destination actual_time osrm_time osrm_distance \
      0
                             383.759164
                                               732.0
                                                          329.0
                                                                       446.5496
      1
                             440.973689
                                               830.0
                                                          388.0
                                                                       544.8027
      2
                                                47.0
                              24.644021
                                                           26.0
                                                                        28.1994
         segment_actual_time_sum segment_osrm_distance_sum segment_osrm_time_sum
      0
                           728.0
                                                   670.6205
                                                                              534.0
```

```
1
                           820.0
                                                   649.8528
                                                                             474.0
      2
                            46.0
                                                    28.1995
                                                                              26.0
      [3 rows x 21 columns]
[28]: # getting info of one trip id from segment table
      segment[segment['trip_uuid'] == 'trip-153671041653548748']
[28]:
        index
                                                    segment_key
                                                                     data \
            0 trip-153671041653548748IND209304AAAIND000000ACB training
             1 trip-153671041653548748IND462022AAAIND209304AAA training
                trip_creation_time \
      0 2018-09-12 00:00:16.535741
      1 2018-09-12 00:00:16.535741
                                       route_schedule_uuid route_type \
      0 thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
      1 thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                                FTL
                       trip_uuid source_center
                                                                       source_name \
      0 trip-153671041653548748 IND209304AAA Kanpur_Central_H_6 (Uttar Pradesh)
      1 trip-153671041653548748 IND462022AAA Bhopal_Trnsport_H (Madhya Pradesh)
        destination_center ...
                                           od_start_time \
              IND000000ACB ... 2018-09-12 16:39:46.858469
      0
              IND209304AAA ... 2018-09-12 00:00:16.535741
                       od_end_time start_scan_to_end_scan \
      0 2018-09-13 13:40:23.123744
                                                   1260.0
      1 2018-09-12 16:39:46.858469
                                                    999.0
        actual_distance_to_destination actual_time osrm_time osrm_distance \
      0
                                               732.0
                             383.759164
                                                          329.0
                                                                      446.5496
      1
                             440.973689
                                               830.0
                                                          388.0
                                                                      544.8027
        segment_actual_time_sum segment_osrm_distance_sum segment_osrm_time_sum
      0
                           728.0
                                                   670.6205
                                                                             534.0
                           820.0
                                                   649.8528
                                                                             474.0
      1
      [2 rows x 21 columns]
[29]: # getting the info of segment table
      segment.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 26222 entries, 0 to 26221

```
#
          Column
                                          Non-Null Count
                                                         Dtype
          _____
      0
                                          26222 non-null
                                                          int64
          index
      1
          segment key
                                          26222 non-null object
      2
          data
                                          26222 non-null object
      3
         trip creation time
                                          26222 non-null datetime64[ns]
          route_schedule_uuid
                                          26222 non-null object
      5
         route_type
                                          26222 non-null object
      6
         trip_uuid
                                          26222 non-null object
      7
          source_center
                                          26222 non-null object
      8
          source_name
                                          26222 non-null object
          destination_center
                                          26222 non-null object
      10 destination_name
                                          26222 non-null
                                                         object
      11 od_start_time
                                          26222 non-null
                                                         datetime64[ns]
                                          26222 non-null datetime64[ns]
      12 od_end_time
         start_scan_to_end_scan
                                          26222 non-null float64
      14 actual_distance_to_destination 26222 non-null float64
         actual_time
      15
                                          26222 non-null float64
      16
         osrm time
                                          26222 non-null float64
      17
          osrm_distance
                                          26222 non-null float64
          segment actual time sum
                                          26222 non-null float64
          segment_osrm_distance_sum
                                          26222 non-null float64
                                          26222 non-null float64
          segment osrm time sum
     dtypes: datetime64[ns](3), float64(8), int64(1), object(9)
     memory usage: 4.2+ MB
     2.1 Feature Creation
     2.1.1 Calculate time taken between od start time and od end time
[30]: #qetting the time difference between od start time and od end time in hour in
       →an separate column in segment table
      segment['hour_taken'] = (segment['od_end_time'] - segment['od_start_time']).dt.
       →total_seconds()/60
      segment['hour taken'].head(3)
[30]: 0
          1260.604421
      1
           999.505379
      2
            58.832388
      Name: hour_taken, dtype: float64
[31]: segment.head()
[31]:
        index
                                                   segment_key
            0 trip-153671041653548748IND209304AAAIND000000ACB training
      1
             1 trip-153671041653548748IND462022AAAIND209304AAA training
```

Data columns (total 21 columns):

2 trip-153671042288605164IND561203AABIND562101AAA training

```
3
       3 trip-153671042288605164IND572101AAAIND561203AAB
4
       4 trip-153671043369099517IND000000ACBIND160002AAC
                                                             training
          trip_creation_time
0 2018-09-12 00:00:16.535741
1 2018-09-12 00:00:16.535741
2 2018-09-12 00:00:22.886430
3 2018-09-12 00:00:22.886430
4 2018-09-12 00:00:33.691250
                                  route schedule uuid route type \
  thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
  thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                            FTL
2 thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                       Carting
3 thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                        Carting
4 thanos::sroute:de5e208e-7641-45e6-8100-4d9fb1e...
                                                            FTL
                 trip_uuid source_center
                                                                   source_name
   trip-153671041653548748
                            IND209304AAA
                                           Kanpur_Central_H_6 (Uttar Pradesh)
                            IND462022AAA
                                           Bhopal_Trnsport_H (Madhya Pradesh)
 trip-153671041653548748
                                            Doddablpur_ChikaDPP_D (Karnataka)
 trip-153671042288605164
                            IND561203AAB
3 trip-153671042288605164
                                                Tumkur Veersagr I (Karnataka)
                            IND572101AAA
4 trip-153671043369099517
                            INDO0000ACB
                                                Gurgaon_Bilaspur_HB (Haryana)
                                        od_end_time start_scan_to_end_scan
  destination_center
0
        INDO0000ACB
                     ... 2018-09-13 13:40:23.123744
                                                                     1260.0
        IND209304AAA ... 2018-09-12 16:39:46.858469
1
                                                                      999.0
2
        IND562101AAA ... 2018-09-12 03:01:59.598855
                                                                       58.0
3
        IND561203AAB ... 2018-09-12 02:03:09.655591
                                                                      122.0
        IND160002AAC ... 2018-09-14 17:34:55.442454
                                                                      834.0
  actual_distance_to_destination actual_time
                                                            osrm_distance
                                                osrm_time
                                                     329.0
0
                      383.759164
                                         732.0
                                                                 446.5496
1
                      440.973689
                                         830.0
                                                     388.0
                                                                 544.8027
2
                       24.644021
                                          47.0
                                                     26.0
                                                                  28.1994
3
                       48.542890
                                          96.0
                                                     42.0
                                                                  56.9116
4
                      237.439610
                                         611.0
                                                    212.0
                                                                 281.2109
                            segment_osrm_distance_sum
                                                        segment osrm time sum
   segment_actual_time_sum
0
                     728.0
                                              670.6205
                                                                         534.0
1
                     820.0
                                              649.8528
                                                                         474.0
2
                      46.0
                                               28.1995
                                                                          26.0
3
                      95.0
                                               55.9899
                                                                          39.0
4
                     608.0
                                              317.7408
                                                                         231.0
```

hour_taken 0 1260.604421

```
2
        58.832388
    3 122.779486
       834.638929
    [5 rows x 22 columns]
[32]: # creating another dictionary for aggregation in gesment table

¬'first', 'source_center' : 'first', 'source_name' : 'first',

               'destination_center' : 'last', 'destination_name' : 'last',

¬'actual_distance_to_destination' : 'sum',
               'actual_time' : 'sum', 'osrm_time' : 'sum', 'osrm_distance' : _
     trip_dict
[32]: {'data': 'first',
     'trip_creation_time': 'first',
     'route_schedule_uuid': 'first',
     'route_type': 'first',
     'trip_uuid': 'first',
     'source_center': 'first',
     'source_name': 'first',
     'destination_center': 'last',
     'destination_name': 'last',
     'start_scan_to_end_scan': 'sum',
     'hour_taken': 'sum',
     'actual_distance_to_destination': 'sum',
     'actual_time': 'sum',
     'osrm time': 'sum',
     'osrm_distance': 'sum',
     'segment_actual_time_sum': 'sum',
     'segment_osrm_distance_sum': 'sum',
     'segment_osrm_time_sum': 'sum'}
[88]: # creating another table, groupping by trip id in segment table
    trip = segment.groupby('trip_uuid').agg(trip_dict)
    trip = trip.reset_index(drop = True)
    trip.head()
[88]:
                    trip_creation_time \
    0 training 2018-09-12 00:00:16.535741
    1 training 2018-09-12 00:00:22.886430
```

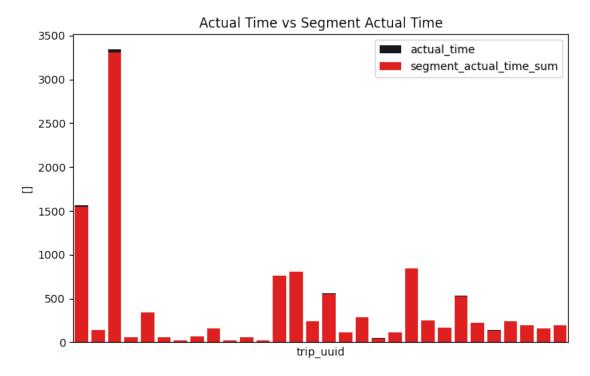
1

999.505379

```
2 training 2018-09-12 00:00:33.691250
3 training 2018-09-12 00:01:00.113710
4 training 2018-09-12 00:02:09.740725
                                  route_schedule_uuid route_type \
  thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                            FTL
  thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                        Carting
2 thanos::sroute:de5e208e-7641-45e6-8100-4d9fb1e...
                                                            FTL
3 thanos::sroute:f0176492-a679-4597-8332-bbd1c7f...
                                                       Carting
4 thanos::sroute:d9f07b12-65e0-4f3b-bec8-df06134...
                                                            FTL
                 trip_uuid source_center
                                                                   source name
 trip-153671041653548748
                            IND209304AAA
                                           Kanpur Central H 6 (Uttar Pradesh)
                                            Doddablpur_ChikaDPP_D (Karnataka)
1 trip-153671042288605164
                            IND561203AAB
                                                Gurgaon_Bilaspur_HB (Haryana)
2 trip-153671043369099517
                             INDO0000ACB
                             IND400072AAB
                                                     Mumbai Hub (Maharashtra)
3 trip-153671046011330457
                                                       Bellary_Dc (Karnataka)
4 trip-153671052974046625
                             IND583101AAA
  destination_center
                                         destination_name
0
        IND209304AAA
                      Kanpur_Central_H_6 (Uttar Pradesh)
                       Doddablpur_ChikaDPP_D (Karnataka)
1
        IND561203AAB
2
        INDO0000ACB
                           Gurgaon Bilaspur HB (Haryana)
3
        IND401104AAA
                           Mumbai_MiraRd_IP (Maharashtra)
                           Sandur WrdN1DPP D (Karnataka)
        IND583119AAA
   start_scan_to_end_scan
                            hour taken
                                        actual distance to destination
                           2260.109800
0
                   2259.0
                                                              824.732854
1
                    180.0
                            181.611874
                                                               73.186911
2
                   3933.0 3934.362520
                                                             1927.404273
3
                            100.494935
                                                               17.175274
                    100.0
4
                    717.0
                            718.349042
                                                              127.448500
   actual_time
                osrm_time
                           osrm_distance
                                           segment_actual_time_sum
0
        1562.0
                    717.0
                                 991.3523
                                                             1548.0
         143.0
                     68.0
                                  85.1110
                                                              141.0
1
2
        3347.0
                   1740.0
                                2354.0665
                                                             3308.0
          59.0
                     15.0
                                  19.6800
                                                              59.0
3
         341.0
                    117.0
                                 146.7918
                                                              340.0
   segment_osrm_distance_sum
                               segment_osrm_time_sum
0
                   1320.4733
                                              1008.0
1
                     84.1894
                                                65.0
2
                   2545.2678
                                              1941.0
3
                     19.8766
                                                16.0
4
                    146.7919
                                               115.0
```

```
[34]: trip1 = trip[['actual_time', 'segment_actual_time_sum', 'trip_uuid']].head(30)
      trip1.head(3)
[34]:
         actual_time segment_actual_time_sum
                                                              trip_uuid
      0
              1562.0
                                       1548.0
                                               trip-153671041653548748
               143.0
      1
                                        141.0
                                               trip-153671042288605164
      2
              3347.0
                                       3308.0 trip-153671043369099517
[35]: # Create the figure with a transparent background
      plt.figure(figsize=(8, 5), facecolor='none')
      sns.barplot(data=trip1, y = 'actual_time', x = 'trip_uuid', label = __
       ⇔'actual_time', color = 'black', alpha = 0.9)
      sns.barplot(data=trip1, y = 'segment_actual_time_sum', x = 'trip_uuid', color = __ 

¬'red', label = 'segment_actual_time_sum')
      plt.title('Actual Time vs Segment Actual Time')
      # Remove x-axis labels
      plt.xticks([])
      plt.ylabel([])
      # Show the plot
      plt.show()
```

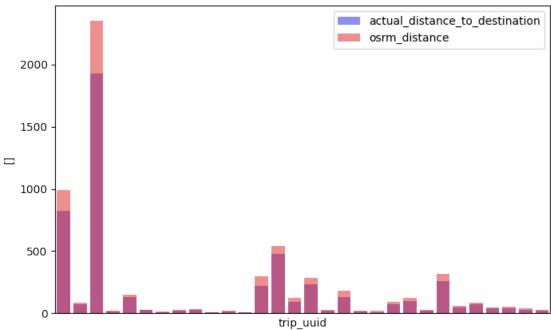


As we can see from the trend, 'actual_time'and 'segment_actual_time_sum'of every 'trip_uuid'

```
[36]: trip.head(3)
[36]:
                          trip_creation_time
             data
        training 2018-09-12 00:00:16.535741
      1 training 2018-09-12 00:00:22.886430
      2 training 2018-09-12 00:00:33.691250
                                       route_schedule_uuid route_type \
      0 thanos::sroute:d7c989ba-a29b-4a0b-b2f4-288cdc6...
                                                                 FTL
      1 thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                            Carting
      2 thanos::sroute:de5e208e-7641-45e6-8100-4d9fb1e...
                                                                 FTL
                       trip_uuid source_center
                                                                        source name
      0 trip-153671041653548748 IND209304AAA Kanpur_Central_H_6 (Uttar Pradesh)
      1 trip-153671042288605164
                                  IND561203AAB
                                                 Doddablpur_ChikaDPP_D (Karnataka)
      2 trip-153671043369099517
                                  INDO0000ACB
                                                      Gurgaon_Bilaspur_HB (Haryana)
        destination_center
                                              destination_name \
                           Kanpur_Central_H_6 (Uttar Pradesh)
      0
              IND209304AAA
      1
              IND561203AAB
                             Doddablpur_ChikaDPP_D (Karnataka)
              INDO0000ACB
                                 Gurgaon_Bilaspur_HB (Haryana)
                                  hour_taken actual_distance_to_destination
         start_scan_to_end_scan
      0
                         2259.0
                                2260.109800
                                                                   824.732854
      1
                          180.0
                                  181.611874
                                                                    73.186911
      2
                         3933.0 3934.362520
                                                                  1927.404273
         actual_time
                     osrm_time
                                 osrm_distance segment_actual_time_sum
      0
              1562.0
                          717.0
                                      991.3523
                                                                  1548.0
               143.0
                           68.0
                                       85.1110
      1
                                                                   141.0
      2
              3347.0
                         1740.0
                                     2354.0665
                                                                  3308.0
         segment_osrm_distance_sum segment_osrm_time_sum
      0
                         1320.4733
                                                   1008.0
      1
                           84.1894
                                                      65.0
      2
                         2545.2678
                                                   1941.0
[37]: # checking the one trip id if from trip table
      trip[trip['trip_uuid']=='trip-153671042288605164']
[37]:
             data
                          trip_creation_time \
      1 training 2018-09-12 00:00:22.886430
                                       route_schedule_uuid route_type \
      1 thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                            Carting
```

```
trip_uuid source_center
                                                                      source_name \
      1 trip-153671042288605164 IND561203AAB Doddablpur_ChikaDPP_D (Karnataka)
                                             destination_name \
        destination_center
             IND561203AAB Doddablpur_ChikaDPP_D (Karnataka)
      1
        start_scan_to_end_scan hour_taken actual_distance_to_destination \
                          180.0 181.611874
                                                                  73.186911
      1
        actual_time osrm_time osrm_distance segment_actual_time_sum \
                                        85.111
               143.0
                           68.0
                                                                  141.0
      1
        segment_osrm_distance_sum segment_osrm_time_sum
      1
                           84.1894
                                                     65.0
[38]: | trip2 = trip[['actual_distance_to_destination', 'osrm_distance', 'trip_uuid']].
      →head(30)
      trip2.head(3)
[38]:
        actual_distance_to_destination osrm_distance
                                                                      trip_uuid
      0
                             824.732854
                                              991.3523 trip-153671041653548748
      1
                              73.186911
                                               85.1110 trip-153671042288605164
      2
                            1927.404273
                                             2354.0665 trip-153671043369099517
[39]: # Create the figure with a transparent background
      plt.figure(figsize=(8, 5), facecolor='none')
      sns.barplot(data=trip2, y = 'actual_distance_to_destination', x = 'trip_uuid', u
      solution = 'actual_distance_to_destination', color = 'blue', alpha = 0.5)
      sns.barplot(data=trip2, y = 'osrm_distance', x = 'trip_uuid', color = 'red', u
       ⇒label = 'osrm_distance', alpha = 0.5)
      plt.title('Actual distance vs osrm distance')
      # Remove x-axis labels
      plt.xticks([])
      plt.ylabel([])
      # Show the plot
      plt.show()
```

Actual distance vs osrm distance



2.2 ### as we can observe that there are slight differences between 'actual distance to destination' and 'osrm distance'

2.2.1 creating function to get the proper names from the columns

```
[42]: def get_city(x):
        city = x.split('(')[0] # getting 'kanpur_central_h_6' from_
       → 'kanpur_central_h_6 (uttar pradesh)'
        city = city.split('_')[0] # getting 'kanpur'
            #Now dealing with edge cases
        if city == 'pnq vadgaon sheri dpc':
          return 'vadgaonsheri'
          # ['PNQ Pashan DPC', 'Bhopal MP Nagar', 'HBR Layout PC',
          # 'PNQ Rahatani DPC', 'Pune Balaji Nagar', 'Mumbai Antop Hill']
          if city in ['pnq pashan dpc','pnq rahatani dpc', 'pune balaji nagar']:
              return 'pune'
          if city == 'hbr layout pc' : return 'bengaluru'
          if city == 'bhopal mp nagar' : return 'bhopal'
          if city == 'mumbai antop hill' : return 'mumbai'
        return city
[43]: def place2city_place(x):
          # We will remove state
          x = x.split('(')[0]
          len_ = len(x.split('_'))
          if len_ >= 3:
              return x.split('_')[1]
          # Small cities have same city and place name
          if len == 2:
              return x.split('_')[0]
          return x.split(' ')[0]
[44]: def get_code(x):
          # We will remove state
          x = x.split('(')[0]
          if len(x.split('_')) >= 3 :
              return x.split('_')[-1]
          return 'none'
[45]: # getting the separate column of place, city, state, code from the
       ⇔destination name
      trip['destination_state'] = trip['destination_name'].apply(lambda x:__
       \rightarrowget_state(x))
      trip['destination_city'] = trip['destination_name'].apply(lambda x:__
       →get_city(x))
```

```
[45]:
            destination_state destination_city destination_place destination_code
      0
                 uttar pradesh
                                          kanpur
                                                             central
      1
                     karnataka
                                      doddablpur
                                                                                     d
                                                            chikadpp
      2
                       haryana
                                         gurgaon
                                                            bilaspur
                                                                                    hb
      3
                   maharashtra
                                          mumbai
                                                              mirard
                                                                                    ip
      4
                     karnataka
                                           sandur
                                                            wrdn1dpp
                                                                                     d
      14782
                                      chandigarh
                                                                                     h
                        punjab
                                                            mehmdpur
      14783
                       haryana
                                       faridabad
                                                            blbgarh
                                                                                    dc
      14784
                 uttar pradesh
                                          kanpur
                                                            govndngr
                                                                                    dc
                    tamil nadu
                                      tirchchndr
                                                            shnmgprm
                                                                                     d
      14785
      14786
                     karnataka
                                          sandur
                                                            wrdn1dpp
                                                                                     d
```

[14787 rows x 4 columns]

```
[46]: # getting the separate column of place, city, state, code from the source name
trip['source_state'] = trip['source_name'].apply(lambda x: get_state(x))
trip['source_city'] = trip['source_name'].apply(lambda x: get_city(x))
trip['source_place'] = trip['source_name'].apply(lambda x: place2city_place(x))
trip['source_code'] = trip['source_name'].apply(lambda x: get_code(x))
trip[['source_state', 'source_city', 'source_place', 'source_code']]
```

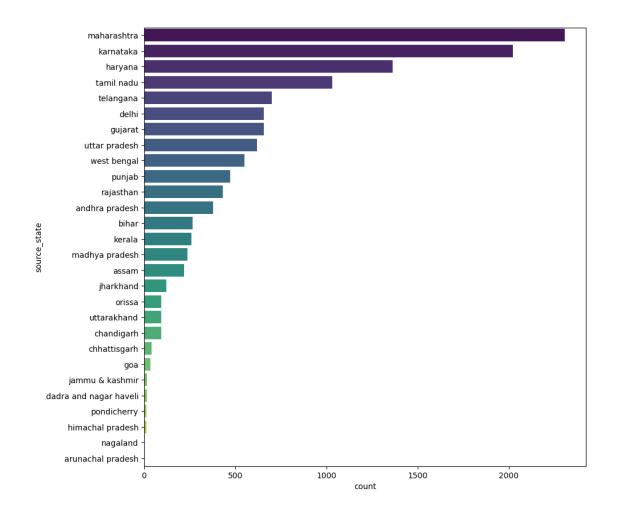
```
[46]:
              source_state
                             source_city source_place source_code
      0
             uttar pradesh
                                   kanpur
                                                central
      1
                                                                   d
                  karnataka
                              doddablpur
                                               chikadpp
      2
                    haryana
                                  gurgaon
                                              bilaspur
                                                                  hb
      3
               maharashtra
                             mumbai hub
                                                 mumbai
                                                               none
      4
                  karnataka
                                  bellary
                                                bellary
                                                               none
      14782
                                              mehmdpur
                     punjab
                              chandigarh
                                                                   h
      14783
                    haryana
                                      fbd
                                            balabhgarh
                                                                dpc
             uttar pradesh
      14784
                                   kanpur
                                              govndngr
                                                                  dc
      14785
                 tamil nadu tirunelveli
                                              vdkkusrt
                                                                   i
      14786
                 karnataka
                                                                   d
                                   sandur
                                              wrdn1dpp
```

[14787 rows x 4 columns]

Univariate - Categorical Data

```
[77]: trip_states = trip[['source_state']].value_counts().reset_index()
      trip_states
[77]:
                     source_state
                                    count
      0
                                     2308
                      maharashtra
      1
                        karnataka
                                     2025
      2
                          haryana
                                     1365
      3
                       tamil nadu
                                     1032
      4
                        telangana
                                      701
      5
                            delhi
                                      658
      6
                                      656
                          gujarat
      7
                    uttar pradesh
                                      619
                                      551
      8
                      west bengal
      9
                           punjab
                                      472
                        rajasthan
      10
                                      431
      11
                   andhra pradesh
                                      378
      12
                            bihar
                                      267
                                      261
      13
                           kerala
      14
                   madhya pradesh
                                      238
                                      220
      15
                            assam
      16
                        jharkhand
                                      123
      17
                           orissa
                                       94
      18
                      uttarakhand
                                       93
      19
                       chandigarh
                                       93
      20
                     chhattisgarh
                                       42
      21
                                       34
                               goa
      22
                  jammu & kashmir
                                       16
      23
          dadra and nagar haveli
                                       15
      24
                      pondicherry
                                       12
      25
                himachal pradesh
                                       12
      26
                         nagaland
                                        4
      27
                arunachal pradesh
                                        3
     Visualization of above chart
[81]: plt.figure(figsize=(10,10))
      sns.barplot(data = trip_states, y = 'source_state', x = 'count', u
        ⇔palette='viridis')
```

[81]: <Axes: xlabel='count', ylabel='source_state'>



From the above chart, we get to know that from Maharashtra, maximum trip starts. North, South and West Zones corridors have significant traffic of orders. But, have a smaller presence in Central, Eastern and North-Eastern zone

```
[47]: # getting the separate columns of year, month, hour, day , week, day of week, \( \trip \) from trip_creation_time

trip['trip_year'] = trip['trip_creation_time'].dt.year

trip['trip_month'] = trip['trip_creation_time'].dt.month

trip['trip_hour'] = trip['trip_creation_time'].dt.hour

trip['trip_day'] = trip['trip_creation_time'].dt.day

trip['trip_week'] = trip['trip_creation_time'].dt.isocalendar().week

trip['trip_dayofweek'] = trip['trip_creation_time'].dt.dayofweek

trip[['trip_year', 'trip_month', 'trip_hour', 'trip_day', 'trip_week', \( \trip \) o''trip_dayofweek']]
```

```
[47]: trip_year trip_month trip_hour trip_day trip_week trip_dayofweek 0 2018 9 0 12 37 2
```

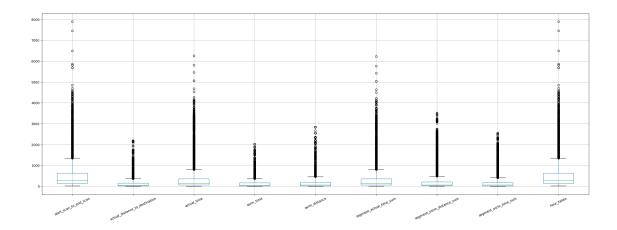
1	2018	9	0	12	37	2
2	2018	9	0	12	37	2
3	2018	9	0	12	37	2
4	2018	9	0	12	37	2
•••	•••		•••	•••	•••	
14782	2018	10	23	3	40	2
14783	2018	10	23	3	40	2
14784	2018	10	23	3	40	2
14785	2018	10	23	3	40	2
14786	2018	10	23	3	40	2

[14787 rows x 6 columns]

2.3 Find outliers in numerical variable

```
[49]: trip[num_col].boxplot(rot=25, figsize=(30,10))
```

[49]: <Axes: >



as we can observe, every numerical column has outliers

2.4 Handle the outliers using IQR method

⇔percentile)

[50]: Q1 = trip[num_col].quantile(0.25) #Calculates the first quartile (25th_

Q3 = trip[num_col].quantile(0.75) # Calculates the third quartile (75th μ)

```
⇔percentile)
      IQR = Q3 - Q1 # Computes the Interquartile Range
      # Filtering out the Outliers, keeping the rowa that are not outliers from trip_{\sqcup}
       \hookrightarrow dataframe
      trip = trip[~((trip[num_col) < (Q1 - 1.5 * IQR)) | (trip[num_col] > (Q3 + 1.5 *_U)]

→IQR))).any(axis=1)]
      trip = trip.reset_index(drop=True)
      trip.head(3)
[50]:
             data
                          trip_creation_time \
      0 training 2018-09-12 00:00:22.886430
      1 training 2018-09-12 00:01:00.113710
      2 training 2018-09-12 00:02:09.740725
                                        route_schedule_uuid route_type \
      0 thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                             Carting
      1 thanos::sroute:f0176492-a679-4597-8332-bbd1c7f...
                                                              Carting
      2 thanos::sroute:d9f07b12-65e0-4f3b-bec8-df06134...
                                                                  FTL
                                                                        source_name \
                       trip_uuid source_center
      0 trip-153671042288605164 IND561203AAB doddablpur_chikadpp_d (karnataka)
                                                          mumbai hub (maharashtra)
      1 trip-153671046011330457 IND400072AAB
```

2 trip-153671052974046625 IND583101AAA

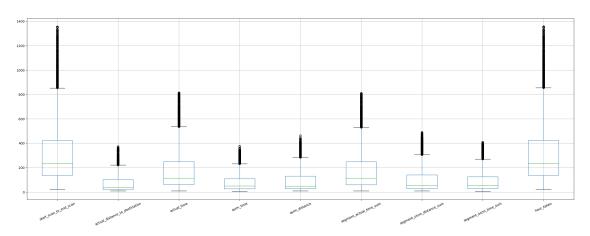
bellary_dc (karnataka)

```
destination_center
                                        destination_name
        IND561203AAB doddablpur_chikadpp_d (karnataka)
0
                         mumbai_mirard_ip (maharashtra)
1
        IND401104AAA
2
        IND583119AAA
                          sandur_wrdn1dpp_d (karnataka)
   start_scan_to_end_scan ... source_state source_city
                                                          source_place \
0
                                              doddablpur
                                                               chikadpp
                    180.0 ...
                                  karnataka
1
                    100.0 ...
                               maharashtra mumbai hub
                                                                 mumbai
2
                                  karnataka
                    717.0 ...
                                                 bellary
                                                                bellary
   source_code
               trip_year trip_month trip_hour trip_day trip_week \
0
             d
                     2018
                                     9
                                                0
                                                          12
                                                                    37
                     2018
                                     9
                                                0
                                                          12
                                                                    37
1
          none
                     2018
                                     9
                                                0
                                                          12
                                                                    37
          none
  trip_dayofweek
0
               2
1
2
               2
```

[3 rows x 32 columns]

```
[51]: # getting the chart after filtering the trip dataframe trip[num_col].boxplot(rot=25, figsize=(30,10))
```

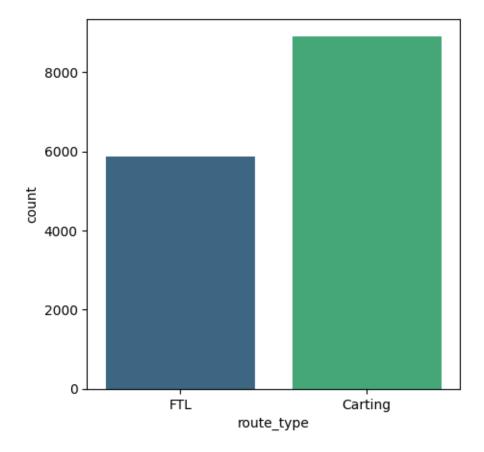
[51]: <Axes: >



2.5 Categorical Variables

```
[89]: # getting the count of two types of route types
      trip['route_type'].value_counts()
[89]: route_type
     Carting
                8906
      FTL
                 5881
     Name: count, dtype: int64
[91]: # visualization of above chart
     plt.figure(figsize=(5,5))
      sns.countplot(data = trip, x = 'route_type',palette='viridis')
```

[91]: <Axes: xlabel='route_type', ylabel='count'>



```
[56]: #mapping the 2 trpes of routes
      trip['route_type'] = trip['route_type'].map({'FTL':0, 'Carting':1})
[58]: trip
```

```
[58]:
                 data
                               trip_creation_time
      0
             training 2018-09-12 00:00:22.886430
      1
             training 2018-09-12 00:01:00.113710
      2
             training 2018-09-12 00:02:09.740725
             training 2018-09-12 00:02:34.161600
      3
             training 2018-09-12 00:04:22.011653
      4
      12718
                 test 2018-10-03 23:55:56.258533
      12719
                 test 2018-10-03 23:57:23.863155
                 test 2018-10-03 23:57:44.429324
      12720
      12721
                 test 2018-10-03 23:59:14.390954
                 test 2018-10-03 23:59:42.701692
      12722
                                             route_schedule_uuid
                                                                   route_type
      0
             thanos::sroute:3a1b0ab2-bb0b-4c53-8c59-eb2a2c0...
                                                                        NaN
      1
             thanos::sroute:f0176492-a679-4597-8332-bbd1c7f...
                                                                        NaN
      2
             thanos::sroute:d9f07b12-65e0-4f3b-bec8-df06134...
                                                                        NaN
      3
                                                                        NaN
             thanos::sroute:9bf03170-d0a2-4a3f-aa4d-9aaab3d...
      4
             thanos::sroute:a97698cc-846e-41a7-916b-88b1741...
                                                                        NaN
      12718
             thanos::sroute:8a120994-f577-4491-9e4b-b7e4a14...
                                                                        NaN
      12719
             thanos::sroute:b30e1ec3-3bfa-4bd2-a7fb-3b75769...
                                                                        NaN
      12720
             thanos::sroute:5609c268-e436-4e0a-8180-3db4a74...
                                                                        NaN
      12721
             thanos::sroute:c5f2ba2c-8486-4940-8af6-d1d2a6a...
                                                                        NaN
      12722
             thanos::sroute:412fea14-6d1f-4222-8a5f-a517042...
                                                                        NaN
                            trip_uuid source_center
      0
             trip-153671042288605164
                                        IND561203AAB
      1
             trip-153671046011330457
                                        IND400072AAB
      2
             trip-153671052974046625
                                        IND583101AAA
      3
             trip-153671055416136166
                                        IND600056AAA
      4
             trip-153671066201138152
                                        IND600044AAD
      12718
            trip-153861095625827784
                                       IND160002AAC
      12719
             trip-153861104386292051
                                        IND121004AAB
      12720
             trip-153861106442901555
                                        IND208006AAA
      12721
             trip-153861115439069069
                                        IND627005AAA
      12722
             trip-153861118270144424
                                        IND583119AAA
                                       source_name destination_center
      0
               doddablpur_chikadpp_d (karnataka)
                                                         IND561203AAB
                         mumbai hub (maharashtra)
      1
                                                         IND401104AAA
      2
                           bellary_dc (karnataka)
                                                         IND583119AAA
      3
                chennai_poonamallee (tamil nadu)
                                                          IND600056AAA
               chennai_chrompet_dpc (tamil nadu)
      4
                                                          IND600048AAA
      12718
                   chandigarh_mehmdpur_h (punjab)
                                                         IND160002AAC
```

```
12719
               fbd_balabhgarh_dpc (haryana)
                                                     IND121004AAA
12720
        kanpur_govndngr_dc (uttar pradesh)
                                                     IND208006AAA
       tirunelveli_vdkkusrt_i (tamil nadu)
12721
                                                     IND628204AAA
12722
              sandur_wrdn1dpp_d (karnataka)
                                                     IND583119AAA
                           destination_name
                                               start_scan_to_end_scan
0
        doddablpur_chikadpp_d (karnataka)
                                                                 180.0
1
            mumbai_mirard_ip (maharashtra)
                                                                 100.0
2
             sandur wrdn1dpp d (karnataka)
                                                                 717.0
3
         chennai_poonamallee (tamil nadu)
                                                                 189.0
4
         chennai vandalur dc (tamil nadu)
                                                                  98.0
12718
            chandigarh_mehmdpur_h (punjab)
                                                                 257.0
12719
            faridabad_blbgarh_dc (haryana)
                                                                  60.0
       kanpur_govndngr_dc (uttar pradesh)
                                                                 421.0
12720
       tirchchndr_shnmgprm_d (tamil nadu)
12721
                                                                 347.0
12722
             sandur_wrdn1dpp_d (karnataka)
                                                                 353.0
        source_state
                        source_city
                                      source_place
                                                     source_code
                                                                   trip_year
0
            karnataka
                         doddablpur
                                          chikadpp
                                                                         2018
1
                       mumbai hub
                                                                         2018
         maharashtra
                                            mumbai
                                                             none
2
            karnataka
                            bellary
                                           bellary
                                                                         2018
                                                             none
3
           tamil nadu
                            chennai
                                           chennai
                                                                         2018
                                                             none
           tamil nadu
                            chennai
                                          chrompet
                                                              dpc
                                                                         2018
                                                               •••
12718
               punjab
                         chandigarh
                                          mehmdpur
                                                                h
                                                                         2018
12719
              haryana
                                fbd
                                        balabhgarh
                                                              dpc
                                                                         2018
       uttar pradesh
                                          govndngr
                                                                         2018
12720
                             kanpur
                                                               dc
12721
           tamil nadu
                        tirunelveli
                                          vdkkusrt
                                                                i
                                                                         2018
12722
                                                                d
                                                                         2018
           karnataka
                             sandur
                                          wrdn1dpp
                    trip_hour
                                trip_day trip_week trip_dayofweek
       trip_month
                                       12
0
                 9
                             0
                                                  37
                 9
                                                                   2
1
                             0
                                       12
                                                  37
2
                 9
                                                                   2
                             0
                                       12
                                                  37
3
                 9
                             0
                                       12
                                                  37
                                                                   2
4
                 9
                             0
                                       12
                                                                   2
                                                  37
                                        •••
                                                                   2
12718
                10
                            23
                                        3
                                                  40
                10
                            23
                                        3
                                                                   2
12719
                                                  40
12720
                            23
                                        3
                                                                   2
                10
                                                  40
                                                                   2
12721
                10
                            23
                                        3
                                                  40
12722
                10
                            23
                                        3
                                                  40
```

[12723 rows x 32 columns]

2.5.1 Standardize the numerical features using StandardScaler

```
[61]: from sklearn.preprocessing import StandardScaler
      # standardize features and calculates the mean and standard deviation for each
      ⇔of these columns.
      scaler = StandardScaler()
      scaler.fit(trip[num_col])
[61]: StandardScaler()
[63]: \#transform the specified numerical columns, making them have a mean of 0 and a_{\sqcup}
       ⇔standard deviation of 1
      trip[num_col] = scaler.transform(trip[num_col])
      trip[num col]
[63]:
             start_scan_to_end_scan actual_distance_to_destination actual_time \
                                                                        -1.123469
                          -1.255068
                                                           -1.003307
      1
                          -1.256293
                                                           -1.014092
                                                                        -1.126828
      2
                          -1.246845
                                                           -0.992860
                                                                        -1.115552
      3
                          -1.254930
                                                           -1.012663
                                                                        -1.126748
      4
                          -1.256323
                                                           -1.015647
                                                                        -1.128227
      12718
                          -1.253889
                                                           -1.006277
                                                                        -1.125868
      12719
                          -1.256905
                                                           -1.014412
                                                                        -1.128347
      12720
                          -1.251377
                                                           -1.009950
                                                                        -1.117911
      12721
                          -1.252510
                                                           -0.991459
                                                                        -1.118631
      12722
                          -1.252419
                                                           -1.004675
                                                                        -1.118191
                        osrm_distance segment_actual_time_sum \
             osrm_time
      0
             -1.086461
                            -1.025065
                                                      -1.120464
      1
             -1.096592
                            -1.033222
                                                      -1.123787
      2
             -1.077095
                            -1.017376
                                                      -1.112401
      3
             -1.095063
                            -1.032177
                                                      -1.123747
             -1.096974
                            -1.034177
                                                      -1.125205
      12718 -1.087608
                            -1.026517
                                                      -1.122855
      12719 -1.097165
                            -1.033670
                                                      -1.125327
      12720 -1.090284
                            -1.028332
                                                      -1.114791
      12721 -1.065245
                            -1.014344
                                                      -1.115723
      12722 -1.086461
                            -1.025630
                                                      -1.115075
             segment_osrm_distance_sum segment_osrm_time_sum hour_taken
      0
                             -1.034821
                                                     -1.082525
                                                                 -1.256735
      1
                             -1.041975
                                                     -1.090258
                                                                 -1.257974
      2
                             -1.027858
                                                     -1.074634
                                                                 -1.248537
      3
                             -1.041064
                                                     -1.089154
                                                                 -1.256599
```

```
4
                       -1.042849
                                              -1.090732
                                                           -1.258012
                           •••
12718
                       -1.036972
                                              -1.082999
                                                           -1.255568
12719
                       -1.042397
                                              -1.091047
                                                           -1.258583
12720
                       -1.032519
                                              -1.078896
                                                           -1.253062
                       -1.019322
12721
                                              -1.057906
                                                           -1.254186
12722
                       -1.035223
                                              -1.082210
                                                           -1.254096
```

[12723 rows x 9 columns]

max

```
[65]: #get a statistical summary of a specific numerical columns in the DataFrame trip trip[num_col].describe()
```

\

	cribin	.um_corj.descri	.be()								
[65]:		start_scan_to	_end_scan ac	tual_distance_to_desti	nation	actual_time	,				
	count	127	23.000000	000000	12723.000000						
	mean		-1.252921	-1.0	003475	-1.122091					
	std		0.003913	0.0	013876	0.006324					
	min		-1.257472	-1.0	015665	-1.128827					
	25%		-1.255742	-1.0	013279	-1.126748					
	50%		-1.254256	-1.0	009981	-1.124629					
	75%		-1.251347	-0.9	997823	-1.119151					
	max		-1.237075	-0.9	945496	-1.096599					
		osrm_time	osrm_distanc	e segment_actual_time	_sum \						
	count	12723.000000	12723.00000	0 12723.000	0000						
	mean	-1.084466	-1.02424	0 -1.119	9054						
	std	0.013826	0.01116								
	min	-1.098312	-1.03454	5 -1.12							
	25%	-1.094298	-1.03214	2 -1.12	-1.123747 -1.121599						
	50%	-1.089902	-1.02964	0 -1.12							
	75%	-1.078624	-1.01930	5 -1.110	6129						
	max	-1.027590	-0.97789	6 -1.09	3356						
		segment_osrm_	-	segment_osrm_time_sum		ır_taken					
	count		12723.000000	12723.000000		3.000000					
	mean		-1.033288	-1.079226	-1	.254606					
	std		0.010547	0.012563	0	.003908					
	min		-1.043177	-1.091837	-1	.259151					
	25%		-1.040912	-1.088365		.257424					
	50%		-1.038169	-1.084419	-1	.255942					
	75%		-1.028554	-1.073056	-1	.253034					

There is a significant difference between OSRM and actual parameters.

-0.989729

-1.028394

-1.238776

3 Recomendation

- 1. There is a significant difference between OSRM and actual parameters.
- 2. We need to check information fed to routing engine for trip planning.
- 3. North, South and West Zones have significant numbers of orders.
- 4. we need to increasing our presence in Central, Eastern and North-Eastern zone. As we have small presence in these area.
- 5. we have maximum number of orders in Mahrashtra followed by Karnataka.
- 6. we need to prepare for resources on ground level in these states on festivels

	[]:]:]:	:																																																				
--	-----	----	----	---	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--	--