

PUBLIC TRANSPORTATION EFFICIENCY ANALYSIS DOCUMENTATION

Objective:

The objective of the "Public Transportation Efficiency Analysis " project is to evaluate the effectiveness and quality of public transportation services within a specific region. Through this analysis, we aim to identify areas for improvement, optimize transportation routes, and enhance overall service efficiency. By collecting and analyzing relevant data, our goal is to provide valuable insights and recommendations that can support the enhancement of public transportation infrastructure, making it more reliable, accessible, and convenient for the community. This project seeks to contribute to the improvement of public transportation systems, ultimately benefiting both passengers and the environment by encouraging the use of sustainable and efficient transit options.

Analysis Objective:

To collect the data of number of trips, what are the route from the user and collecting information from user such as starting point and ending point from the user and finally from the bus management getting the number of passengers from each trip with complete details

Data Collection:

THE DATASET WHICH IS PROVIDED IS → <https://www.kaggle.com/datasets/rednivrug/unisys?select=20140711.CSV>

The data fields in the given file are:

- TripID
- RouteID
- StopID
- StopName
- WeekBeginning
- NumberOfBoarding
- Latitude Longitude
- Type
- PostCode
- RouteDesc

```
TripID      39282
RouteID      619
StopID       7397
StopName     4165
WeekBeginning    54
NumberOfBoardings  400
formatted_address 3242
latitude     3029
longitude    3008
postcode     207
type         16
route_desc   440
dist_from_centre 3033
holiday_label    3
dtype: int64
```

Data Visualization & Code Implementation

Tools/package

python
Python

Purpose

Data Analysis
Data Visualization

ransportation-efficiency-analysis

November 1, 2023

```
[1]: import pandas as pd
```

```
data=pd.read_csv("C:/Users/abuba/Downloads/publicTransport.csv")
data
```

C:\Users\abuba\AppData\Local\Temp\ipykernel_5396\2646756992.py:3: DtypeWarning: Columns (1) have mixed types. Specify dtype option on import or set low_memory=False.

```
data=pd.read_csv("C:/Users/abuba/Downloads/publicTransport.csv")
```

```
[1]:
```

	TripID	RouteID	StopID	StopName \
0	23631	100	14156	181 Cross Rd
1	23631	100	14144	177 Cross Rd
2	23632	100	14132	175 Cross Rd
3	23633	100	12266	Zone A Arndale Interchange
4	23633	100	14147	178 Cross Rd
...
10857229	13346	W91C	14629	21 Cashel St
10857230	13346	W91C	14708	22 Cashel St
10857231	13346	W91C	13709	2 Greenhill Rd
10857232	13346	W91C	14029	10 East Av
10857233	13346	W91C	13824	6 Leader St

	WeekBeginning	NumberOfBoardings
0	2013-06-30 00:00:00	1
1	2013-06-30 00:00:00	1
2	2013-06-30 00:00:00	1
3	2013-06-30 00:00:00	2
4	2013-06-30 00:00:00	1
...
10857229	2014-07-06 00:00:00	1
10857230	2014-07-06 00:00:00	3
10857231	2014-07-06 00:00:00	1
10857232	2014-07-06 00:00:00	1
10857233	2014-07-06 00:00:00	1

[10857234 rows x 6 columns]

```
[2]: data.head(10)
```

```
[2]:
```

	TripID	RouteID	StopID	StopName	WeekBeginning	\
0	23631	100	14156	181 Cross Rd	2013-06-30 00:00:00	
1	23631	100	14144	177 Cross Rd	2013-06-30 00:00:00	
2	23632	100	14132	175 Cross Rd	2013-06-30 00:00:00	
3	23633	100	12266	Zone A Arndale Interchange	2013-06-30 00:00:00	
4	23633	100	14147	178 Cross Rd	2013-06-30 00:00:00	
5	23634	100	13907	9A Marion Rd	2013-06-30 00:00:00	
6	23634	100	14132	175 Cross Rd	2013-06-30 00:00:00	
7	23634	100	13335	9A Holbrooks Rd	2013-06-30 00:00:00	
8	23634	100	13875	9 Marion Rd	2013-06-30 00:00:00	
9	23634	100	13045	206 Holbrooks Rd	2013-06-30 00:00:00	

	NumberOfBoardings
0	1
1	1
2	1
3	2
4	1
5	1
6	1
7	1
8	1
9	1

```
[3]: data.shape
```

```
[3]: (10857234, 6)
```

```
[4]: data.columns
```

```
[4]: Index(['TripID', 'RouteID', 'StopID', 'StopName', 'WeekBeginning',  
        'NumberOfBoardings'],  
        dtype='object')
```

```
[5]: data.isnull().sum()
```

```
[5]: TripID          0  
RouteID          0  
StopID           0  
StopName         0  
WeekBeginning    0  
NumberOfBoardings 0  
dtype: int64
```

```
[6]: data.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 10857234 entries, 0 to 10857233
Data columns (total 6 columns):
#   Column                Dtype
---  -
0   TripID                 int64
1   RouteID                object
2   StopID                 int64
3   StopName               object
4   WeekBeginning          object
5   NumberOfBoardings      int64
dtypes: int64(3), object(3)
memory usage: 497.0+ MB

```

```
[7]: df=data
```

```
[8]: a=df.TripID.value_counts()
a
```

```

[8]: 57020    2819
     57018    2741
     27478    2733
     57041    2718
     57029    2691
           ...
     59297     1
     3061     1
     3414     1
     3415     1
     61163     1
     Name: TripID, Length: 39282, dtype: int64

```

```
[9]: b=df.RouteID.value_counts()
b
```

```

[9]: G10      358005
     B10      332694
     M44      331442
     H30      326004
     300      228373
           ...
     FX1         1
     FX10        1
     FX8         1
     FX3         1
     FX2         1
     Name: RouteID, Length: 619, dtype: int64

```

```
[10]: c=df.StopID.value_counts()
      c
```

```
[10]: 13354      44089
      13277      43339
      13364      43265
      13330      36992
      13279      33800
      ...
      17107         1
      15420         1
      15243         1
      17805         1
      17807         1
      Name: StopID, Length: 7397, dtype: int64
```

```
[11]: d=df.WeekBeginning.value_counts()
      d
```

```
[11]: 2014-03-02 00:00:00      217162
      2014-05-18 00:00:00      215932
      2014-05-11 00:00:00      214947
      2014-06-01 00:00:00      213789
      2014-05-04 00:00:00      212681
      2014-03-23 00:00:00      212552
      2014-03-16 00:00:00      212188
      2014-02-23 00:00:00      212103
      2013-09-08 00:00:00      211914
      2014-04-27 00:00:00      211782
      2014-05-25 00:00:00      211534
      2014-03-30 00:00:00      211460
      2013-09-01 00:00:00      210968
      2014-04-06 00:00:00      210557
      2013-08-25 00:00:00      209497
      2013-11-17 00:00:00      209341
      2013-11-24 00:00:00      208881
      2013-10-20 00:00:00      208655
      2013-12-01 00:00:00      208470
      2014-06-15 00:00:00      208457
      2014-06-08 00:00:00      208417
      2013-09-15 00:00:00      208241
      2014-02-16 00:00:00      208178
      2013-10-27 00:00:00      207971
      2013-09-22 00:00:00      207769
      2013-12-08 00:00:00      207353
      2013-10-13 00:00:00      207351
      2013-08-04 00:00:00      207082
```

```

2013-11-03 00:00:00    206863
2013-11-10 00:00:00    206853
2014-06-29 00:00:00    206138
2013-07-28 00:00:00    205492
2013-08-11 00:00:00    205385
2013-08-18 00:00:00    203852
2013-07-21 00:00:00    201257
2014-06-22 00:00:00    200950
2014-02-09 00:00:00    197978
2014-01-19 00:00:00    196344
2013-10-06 00:00:00    195830
2014-03-09 00:00:00    195200
2013-12-15 00:00:00    194102
2014-02-02 00:00:00    192507
2013-09-29 00:00:00    192023
2013-07-07 00:00:00    190543
2014-04-13 00:00:00    190060
2013-07-14 00:00:00    187192
2014-01-05 00:00:00    186105
2014-04-20 00:00:00    185080
2013-06-30 00:00:00    182229
2014-01-26 00:00:00    180259
2014-01-12 00:00:00    178456
2013-12-29 00:00:00    168771
2013-12-22 00:00:00    163331
2014-07-06 00:00:00    149202
Name: WeekBeginning, dtype: int64

```

```
[12]: e=df.NumberOfBoardings.value_counts()
e
```

```

[12]: 1      4270812
      2      2057245
      3      1128820
      4       731537
      5       502763
      ...
      547         1
      539         1
      443         1
      474         1
      342         1
Name: NumberOfBoardings, Length: 400, dtype: int64

```

```
[13]: data['WeekBeginning'] = pd.to_datetime(data['WeekBeginning']).dt.date
data['WeekBeginning'][1]
```

```
[13]: datetime.date(2013, 6, 30)
```

```
[14]: grouped = data.groupby(['StopName', 'WeekBeginning',]).agg({'NumberOfBoardings':  
    ↳ ['sum', 'count', 'max']})  
grouped
```

```
[14]:
```

		NumberOfBoardings		
		sum	count	max
StopName	WeekBeginning			
1 Anzac Hwy	2013-06-30	1003	378	51
	2013-07-07	783	360	28
	2013-07-14	843	343	45
	2013-07-21	710	356	28
	2013-07-28	898	379	41
...	
Zone I Salisbury Interchange	2014-06-08	822	117	44
	2014-06-15	965	113	39
	2014-06-22	896	111	58
	2014-06-29	1052	113	39
	2014-07-06	534	90	21

[207864 rows x 3 columns]

```
[15]: st_week_grp = pd.DataFrame(grouped).reset_index()  
st_week_grp1 = pd.DataFrame(st_week_grp.groupby('StopName')['WeekBeginning'].  
    ↳ count()).reset_index()  
st_week_grp1.head()
```

```
[15]:
```

	StopName	WeekBeginning
0	1 Anzac Hwy	54
1	1 Bartels Rd	54
2	1 Botanic Rd	54
3	1 Frome Rd	54
4	1 Fullarton Rd	54

```
[16]: stopListName = list(st_week_grp1[st_week_grp1['WeekBeginning'] ==  
    ↳ 54]['StopName'])  
stopListName[1:30]
```

```
[16]: ['1 Bartels Rd',  
    '1 Botanic Rd',  
    '1 Frome Rd',  
    '1 Fullarton Rd',  
    '1 George St',  
    '1 Glen Osmond Rd',  
    '1 Goodwood Rd',  
    '1 Henley Beach Rd',
```



```
'1 Kensington Rd',
'1 King William Rd',
'1 Port Rd',
'1 Sir Donald Bradman Dr',
'1 Sir Edwin Smith Av',
'1 Unley Rd',
'10 Holbrooks Rd',
'10 Marion Rd',
'10 Portrush Rd',
'10 Airport Rd',
'10 Anzac Hwy',
'10 Ashley St',
'10 Belair Rd',
'10 Churchill Rd',
'10 East Av',
'10 Fullarton Rd',
'10 Garden Tce',
'10 Glen Osmond Rd',
'10 Goodwood Rd',
'10 Greenhill Rd',
'10 Harrow Tce']
```

```
[17]: stoppageName_with_boarding = data.groupby(['StopName']).agg({'NumberOfBoardings':
↳ ['sum']}).reset_index()
```

```
[18]: stoppageName_with_boarding.columns = ["stopName", "Total_No_of_boardings"]
stoppageName_with_boarding.head()
```

```
[18]:
```

	stopName	Total_No_of_boardings
0	1 Anzac Hwy	39429
1	1 Bartels Rd	8412
2	1 Botanic Rd	14868
3	1 Frome Rd	67458
4	1 Fullarton Rd	585

```
[19]: stoppageName_with_boarding = stoppageName_with_boarding.
↳ sort_values("Total_No_of_boardings", ascending = False)
#stoppage with most no of boarding
stoppageName_with_boarding.head(10)
```

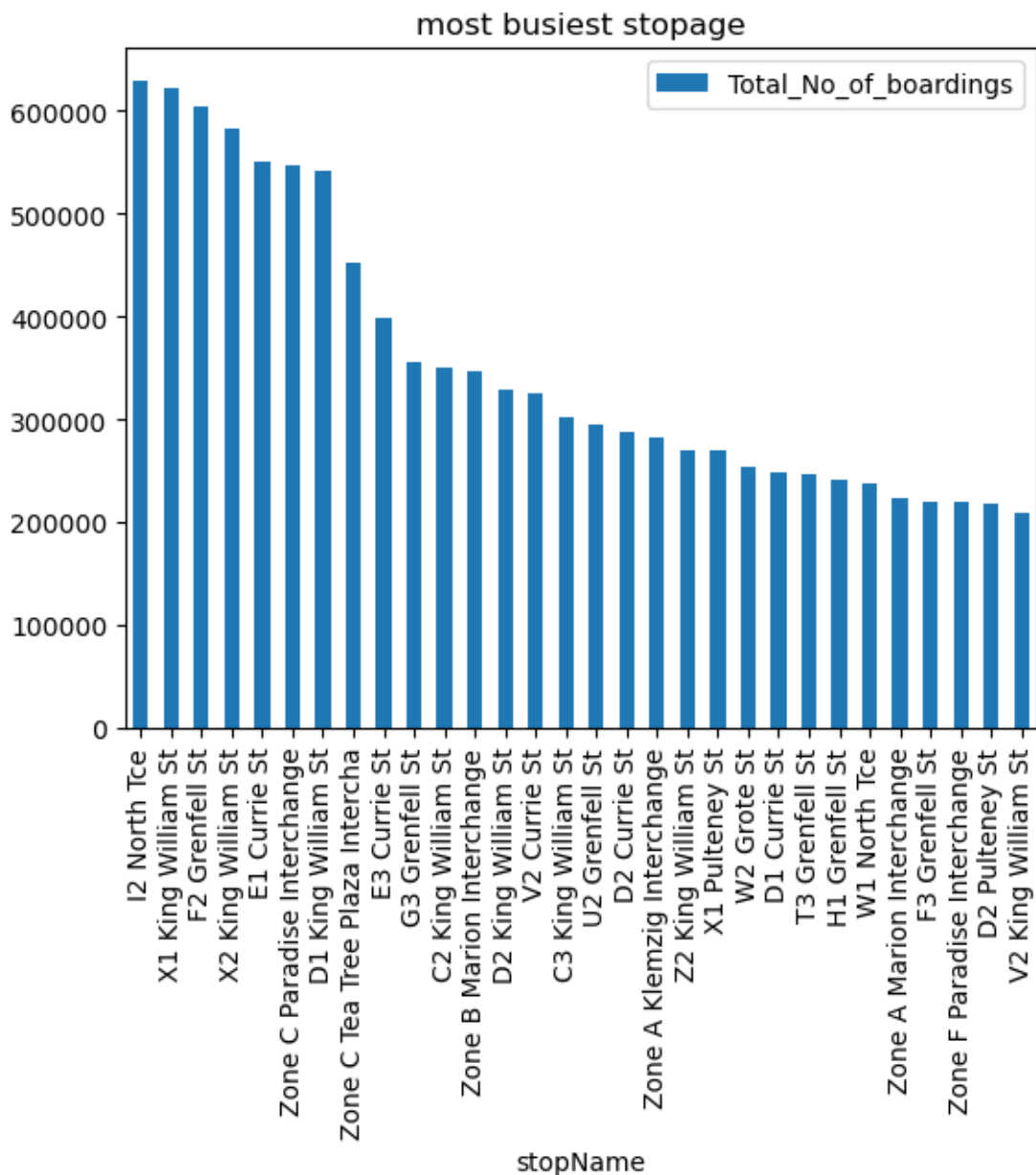
```
[19]:
```

	stopName	Total_No_of_boardings
3841	I2 North Tce	628859
4023	X1 King William St	622099
3807	F2 Grenfell St	604149
4029	X2 King William St	583227
3791	E1 Currie St	550396
4120	Zone C Paradise Interchange	547709

3784	D1 King William St	541046
4124	Zone C Tea Tree Plaza Intercha	451960
3796	E3 Currie St	399351
3819	G3 Grenfell St	356518

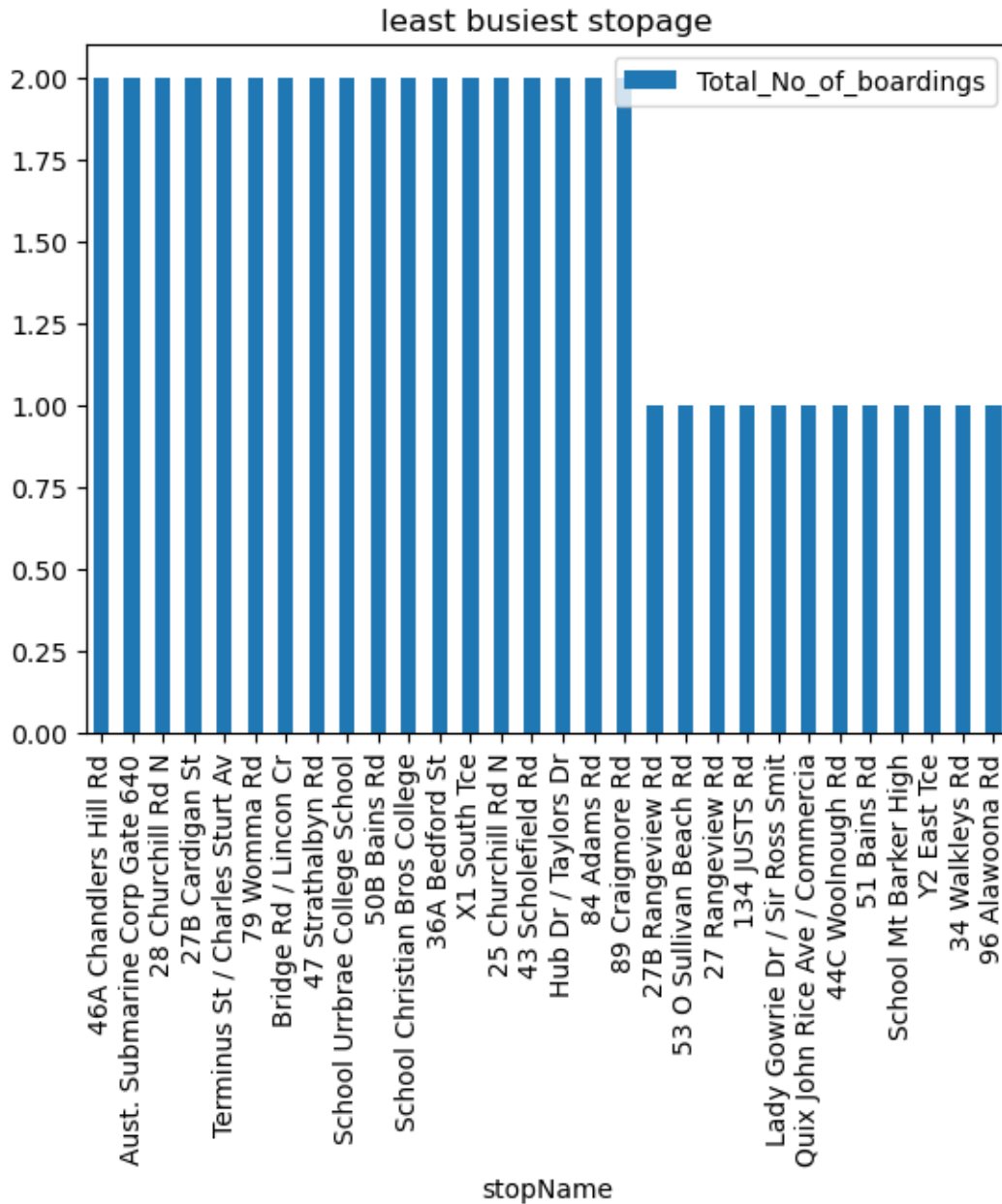
```
[20]: import matplotlib.pyplot as plt
busiestStop = stopageName_with_boarding.head(30).plot.bar(x="stopName",
    ↳y="Total_No_of_boardings", rot=90)
plt.title("most busiest stopage")
plt.legend()
```

[20]: <matplotlib.legend.Legend at 0x2c0194fe350>



```
[21]: leastBusiestStop = stopageName_with_boarding.tail(30).plot.bar(x='stopName',
    ↳y='Total_No_of_boardings', rot=90)
plt.title("least busiest stopage")
plt.legend()
```

```
[21]: <matplotlib.legend.Legend at 0x2c01944b5d0>
```



```
[22]: import matplotlib.pyplot as plt
fig,axrr=plt.subplots(2,2,figsize=(15,15))

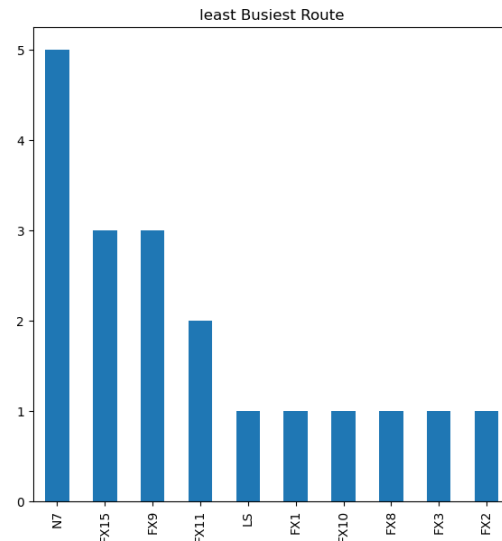
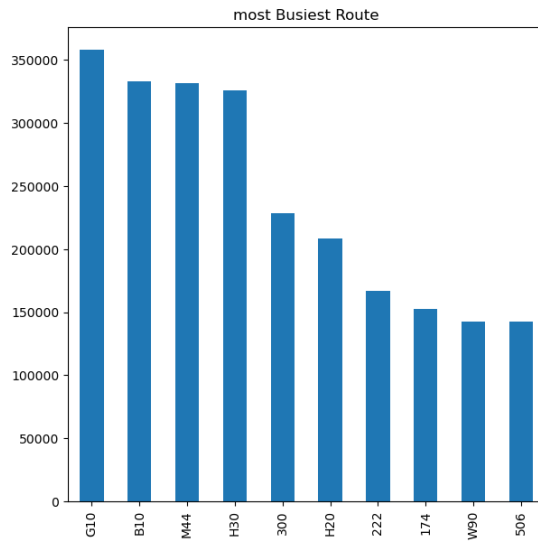
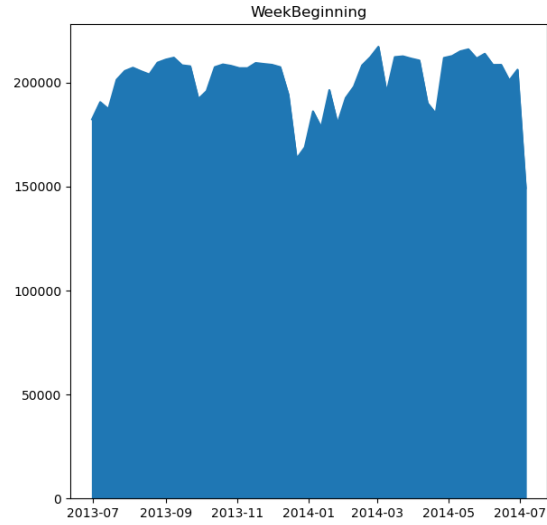
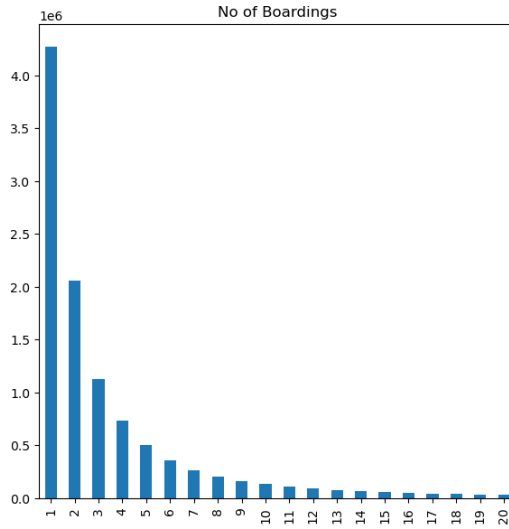
ax=axrr[0][0]
ax.set_title("No of Boardings")
data['NumberOfBoardings'].value_counts().sort_index().head(20).plot.
    ↪ bar(ax=axrr[0][0])

ax=axrr[0][1]
ax.set_title("WeekBeginning")
data['WeekBeginning'].value_counts().plot.area(ax=axrr[0][1])

ax=axrr[1][0]
ax.set_title("most Busiest Route")
data['RouteID'].value_counts().head(10).plot.bar(ax=axrr[1][0])

ax=axrr[1][1]
ax.set_title("least Busiest Route")
data['RouteID'].value_counts().tail(10).plot.bar(ax=axrr[1][1])
```

```
[22]: <Axes: title={'center': 'least Busiest Route'}>
```



```
[23]: from math import sin, cos, sqrt, atan2, radians
def calc_dist(lat1,lon1):
    ## approximate radius of earth in km
    R = 6373.0
    dlon = radians(138.604801) - radians(lon1)
    dlat = radians(-34.921247) - radians(lat1)
    a = sin(dlat / 2)**2 + cos(radians(lat1)) * cos(radians(-34.921247))
    ↪sin(dlon / 2)**2
    c = 2 * atan2(sqrt(a), sqrt(1 - a))
    return R * c
```

```
[25]: out_geo = pd.read_csv('C:/Users/abuba/Downloads/output_geo.csv')
out_geo.shape
```

```
out_geo.head()
```

```
[25]:
```

	accuracy	formatted_address	\
0	ROOFTOP	181 Cross Rd, Westbourne Park SA 5041, Australia	
1	ROOFTOP	177 Cross Rd, Westbourne Park SA 5041, Australia	
2	ROOFTOP	175 Cross Rd, Westbourne Park SA 5041, Australia	
3	GEOMETRIC_CENTER	Zone A Arndale Interchange - South side, Kilke...	
4	ROOFTOP	178 Cross Rd, Malvern SA 5061, Australia	

	google_place_id	input_string	latitude	\
0	ChIJKT7I9rbPsGoRVHMHkIy-Oyk	181 Cross Rd	-34.966656	
1	ChIJ-VFZ87bPsGoRyfVgC5qbPpE	177 Cross Rd	-34.966607	
2	ChIJIztlirbPsGoR38KRk76kPFI	175 Cross Rd	-34.966758	
3	ChIJn0C1hCPGsGoRIWvCdhF1RIg	Zone A Arndale Interchange	-34.875160	
4	ChIJycNiyIvOsGoRdhfq9GKnpq0	178 Cross Rd	-34.964960	

	longitude	number_of_results	postcode	status	\
0	138.592148	1	5041	OK	
1	138.592301	1	5041	OK	
2	138.592715	1	5041	OK	
3	138.551628	1	5009	OK	
4	138.611477	1	5061	OK	

	type
0	street_address
1	street_address
2	street_address
3	bus_station,establishment,point_of_interest,tr...
4	street_address

```
[26]: out_geo['dist_from_centre'] = out_geo[['latitude', 'longitude']].apply(lambda x:
↳ calc_dist(*x), axis=1)
out_geo.head()
```

```
[26]:
```

	accuracy	formatted_address	\
0	ROOFTOP	181 Cross Rd, Westbourne Park SA 5041, Australia	
1	ROOFTOP	177 Cross Rd, Westbourne Park SA 5041, Australia	
2	ROOFTOP	175 Cross Rd, Westbourne Park SA 5041, Australia	
3	GEOMETRIC_CENTER	Zone A Arndale Interchange - South side, Kilke...	
4	ROOFTOP	178 Cross Rd, Malvern SA 5061, Australia	

	google_place_id	input_string	latitude	\
0	ChIJKT7I9rbPsGoRVHMHkIy-Oyk	181 Cross Rd	-34.966656	
1	ChIJ-VFZ87bPsGoRyfVgC5qbPpE	177 Cross Rd	-34.966607	
2	ChIJIztlirbPsGoR38KRk76kPFI	175 Cross Rd	-34.966758	
3	ChIJn0C1hCPGsGoRIWvCdhF1RIg	Zone A Arndale Interchange	-34.875160	
4	ChIJycNiyIvOsGoRdhfq9GKnpq0	178 Cross Rd	-34.964960	

	longitude	number_of_results	postcode	status	\
0	138.592148	1	5041	OK	
1	138.592301	1	5041	OK	
2	138.592715	1	5041	OK	
3	138.551628	1	5009	OK	
4	138.611477	1	5061	OK	

		type	dist_from_centre
0		street_address	5.180961
1		street_address	5.172525
2		street_address	5.180709
3	bus_station,establishment,point_of_interest,tr...		7.057549
4		street_address	4.900099

```
[27]: out_geo['type'].fillna('street_address',inplace=True)
out_geo['type'] = out_geo['type'].apply(lambda x: str(x).split(',')[ -1])
```

```
[28]: out_geo['type'].unique()
```

```
[28]: array(['street_address', 'transit_station', 'premise', 'political',
        'school', 'route', 'intersection', 'point_of_interest',
        'subpremise', 'real_estate_agency', 'university', 'travel_agency',
        'restaurant', 'supermarket', 'store', 'post_office'], dtype=object)
```

```
[29]: data= pd.merge(data,out_geo,how='left',left_on = 'StopName',right_on=
        ↳'input_string')
data.head(5)
data.shape
```

```
[29]: (10857234, 17)
```

```
[30]: col = ['TripID', 'RouteID', 'StopID',
        ↳'StopName', 'WeekBeginning', 'NumberOfBoardings',
        'latitude', 'longitude', 'postcode', 'type', 'dist_from_centre']
data = data[col]
```

```
[31]: new_data = data[data['StopName'].isin(stopListName)]
new_data.shape
print("data without stopage removing: ", data.shape)
print("data, after removing stoppage not having the data of whole 54 weeks:
        ↳",new_data.shape)
```

```
data without stopage removing: (10857234, 11)
data, after removing stoppage not having the data of whole 54 weeks: (10567931,
11)
```

```
[32]: new_data.head(2)
```

```
[32]:   TripID RouteID StopID      StopName WeekBeginning  NumberOfBoardings  \
0    23631     100  14156  181 Cross Rd    2013-06-30                1
1    23631     100  14144  177 Cross Rd    2013-06-30                1

   latitude  longitude  postcode      type  dist_from_centre
0 -34.96656  138.592148    5041  street_address        5.180961
1 -34.966607 138.592301    5041  street_address        5.172525
```

```
[33]: grouped = data.groupby(['StopName', 'WeekBeginning', 'type'])
grouped = data.groupby(['StopName', 'WeekBeginning', 'type']).
    .agg({'NumberOfBoardings': ['sum', 'count', 'max']})
grouped.columns = ["_".join(x) for x in grouped.columns.ravel()]
```

C:\Users\abuba\AppData\Local\Temp\ipykernel_5396\28787847.py:3: FutureWarning: Index.ravel returning ndarray is deprecated; in a future version this will return a view on self.

```
    grouped.columns = ["_".join(x) for x in grouped.columns.ravel()]
```

```
[34]: grouped.head(10)
```

```
[34]:   StopName      WeekBeginning type  NumberOfBoardings_sum  \
1 Anzac Hwy  2013-06-30  street_address                1003
   2013-07-07  street_address                783
   2013-07-14  street_address                843
   2013-07-21  street_address                710
   2013-07-28  street_address                898
   2013-08-04  street_address                799
   2013-08-11  street_address               1012
   2013-08-18  street_address                793
   2013-08-25  street_address                897
   2013-09-01  street_address               1368
```

```
   StopName      WeekBeginning type  NumberOfBoardings_count  \
1 Anzac Hwy  2013-06-30  street_address                378
   2013-07-07  street_address                360
   2013-07-14  street_address                343
   2013-07-21  street_address                356
   2013-07-28  street_address                379
   2013-08-04  street_address                378
   2013-08-11  street_address                358
   2013-08-18  street_address                333
   2013-08-25  street_address                354
   2013-09-01  street_address                431
```


StopName	WeekBeginning	type	NumberOfBoardings_max
1 Anzac Hwy	2013-06-30	street_address	51
	2013-07-07	street_address	28
	2013-07-14	street_address	45
	2013-07-21	street_address	28
	2013-07-28	street_address	41
	2013-08-04	street_address	40
	2013-08-11	street_address	71
	2013-08-18	street_address	41
	2013-08-25	street_address	45
	2013-09-01	street_address	59

```
[35]: grouped.columns
```

```
[35]: Index(['NumberOfBoardings_sum', 'NumberOfBoardings_count',
         'NumberOfBoardings_max'],
         dtype='object')
```

```
[36]: new_data.head(2)
```

```
[36]:   TripID RouteID StopID StopName WeekBeginning NumberOfBoardings \
0    23631    100  14156 181 Cross Rd    2013-06-30             1
1    23631    100  14144 177 Cross Rd    2013-06-30             1

   latitude longitude postcode      type dist_from_centre
0 -34.966656  138.592148    5041 street_address      5.180961
1 -34.966607  138.592301    5041 street_address      5.172525
```

```
[37]: filtered_data = out_geo[out_geo['dist_from_centre'] <= 100]
filtered_data.shape
```

```
[37]: (3960, 11)
```

```
[38]: filtered_data.head(2)
```

```
[38]:   accuracy formatted_address \
0  ROOFTOP  181 Cross Rd, Westbourne Park SA 5041, Australia
1  ROOFTOP  177 Cross Rd, Westbourne Park SA 5041, Australia

   google_place_id input_string latitude longitude \
0  ChIJKT7I9rbPsGoRVHMHkIy-0yk  181 Cross Rd -34.966656  138.592148
1  ChIJ-VFZ87bPsGoRyfVgC5qbPpE  177 Cross Rd -34.966607  138.592301

   number_of_results postcode status      type dist_from_centre
0                1      5041    OK street_address      5.180961
```

1	1	5041	OK	street_address	5.172525
---	---	------	----	----------------	----------

```
[39]: bb_grp = data.groupby(['dist_from_centre']).agg({'NumberOfBoardings': ['sum']}).
      ↪reset_index()
      bb_grp.columns = bb_grp.columns.get_level_values(0)
      bb_grp.head()
      bb_grp.columns
      bb_grp.tail()
```

```
[39]:      dist_from_centre  NumberOfBoardings
3028      16642.619167             57
3029      16643.170375             60
3030      16643.501617            203
3031      16790.222352             31
3032      17237.137089           1992
```

```
[40]: import plotly.graph_objs as go
      from plotly.offline import iplot
      trace0 = go.Scatter(x = bb_grp['dist_from_centre'],
                        y = bb_grp['NumberOfBoardings'], mode = 'lines+markers', name =
      ↪ 'X2 KingWilliam St')
      data1 = [trace0]
      layout = dict(title = 'Distance Vs Number of boarding',
                    xaxis = dict(title = 'Distance from centre'),
                    yaxis = dict(title = 'Number of Boardings'))
      fig = dict(data=data1, layout=layout)
      iplot(fig)
```

```
[41]: x = data["dist_from_centre"]
      distance_10 = []
      distance_10_50 = []
      distance_50_100 = []
      #distance_100_ = []
      distance_100_more = []
      total = 0
      outlier = []
      outlier_ = 0
      for i in x:
          if(i<=10):
              distance_10.append(i)
              total += 1
          elif(i<=50):
              distance_10_50.append(i)
              total += 1
          elif(i<=100):
              distance_50_100.append(i)
              total += 1
```

```
print(outlier_)
```

0

```
[42]: y = len(distance_10)+len(distance_10_50)+len(distance_50_100)
```

```
[43]: print(total)
print("passangers, boarding the buses in the radius of 10Km from the city_
      ↳center = ", (len(distance_10)/total)*100)
print("passanger, boarding the buses from the distance of 10Km to 50Km from the_
      ↳city center = ", (len(distance_10_50)/total)*100)
print("passanger, boarding the buses from the distance of 50Km to 100 from the_
      ↳city center = ", (len(distance_50_100)/total)*100)
```

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passangers, boarding the buses in the radius of 10Km from the city center =
63.955555379484466

passanger, boarding the buses from the distance of 10Km to 50Km from the city
center = 33.57616995941624

passanger, boarding the buses from the distance of 50Km to 100 from the city
center = 2.468274661099299

```
[44]: grouped_route = data.groupby(['RouteID']).agg({'NumberOfBoardings': ['sum',
      ↳'max']})
grouped_route.columns = ["_".join(x) for x in grouped_route.columns.ravel()]
```

C:\Users\abuba\AppData\Local\Temp\ipykernel_5396\1308629243.py:2: FutureWarning:

Index.ravel returning ndarray is deprecated; in a future version this will
return a view on self.

```
[45]: grouped_route = grouped_route.head().reset_index()
type(grouped_route)
```

```
[45]: pandas.core.frame.DataFrame
```

```
[46]: grouped_route = grouped_route.sort_values("NumberOfBoardings_sum", ascending =_
      ↳True)
grouped_route.shape
```

```
[46]: (5, 3)
```

```
[47]: route_data = grouped_route[grouped_route['RouteID'] == ""]
route_data.head()
```

```
[47]: Empty DataFrame
      Columns: [RouteID, NumberOfBoardings_sum, NumberOfBoardings_max]
      Index: []
```

```
[ ]:
```

Conclusion

- Therefore, it Calculates the number of people commuting within a specific route.
- It shows the accuracy means of commute based upon market information.