```
In [274]:
              import pandas as pd
            2
              import numpy as np
              from sklearn.tree import DecisionTreeRegressor, DecisionTreeClassifier
            3
              from sklearn.model selection import train test split
              from sklearn.neighbors import KNeighborsRegressor
              from sklearn.impute import SimpleImputer
            7
              from sklearn.model selection import train test split, GridSearchCV
              from sklearn.linear_model import LogisticRegression,SGDClassifier
              from sklearn.ensemble import VotingClassifier, ExtraTreesClassifier, Ra
           10
              from sklearn.svm import SVC
           11
              from sklearn.metrics import mean squared error
              from sklearn.neural network import MLPClassifier
          12
          13
          14
              from sklearn.linear_model import LinearRegression
          15
              from sklearn.preprocessing import FunctionTransformer
          16
              from sklearn.preprocessing import StandardScaler,OneHotEncoder
              from sklearn.pipeline import Pipeline
           17
              from sklearn.compose import ColumnTransformer
          18
          19
          20
              from sklearn.tree import DecisionTreeRegressor
          21 from sklearn.model selection import train test split
              from sklearn.neighbors import KNeighborsRegressor
           23 from sklearn.model selection import train test split
              pd.set option('display.max columns', 500)
```

Part 1, extract the mean time grouby (origin,dest,weekday,timeslot)

```
In [518]:
            2
               def cleaning2(data, name):
            3
                   col=data['Daily Mean Travel Time']
            4
                   #extract the percentile of col in col
            5
                   func=lambda a:percentileofscore(col,a)
            6
                   percent=col.apply(func)
            7
                   new=data[name].dropna()
            8
                   #apply the percentile of col to name
            9
                   func2=lambda b:np.percentile(new, b)
           10
                   value=percent.apply(func2)
           11
                   data[name]=data[name].fillna(value)
           12
                   return data
           13
           14
           15
In [ ]:
            <option value="The Palace Of Fine Arts, 3601 Lyon St, San Francisco, CA"</pre>
          2
            <option value="Fisherman's Wharf, 286-298 Jefferson St, San Francisco, C</pre>
            <option value="Oracle Park, 24 Willie Mays Plaza, San Francisco, CA">Ora
          3
            <option value="Embarcadero, San Francisco, CA">Embarcadero Bart/option>
            <option value="2nd Street and Stevenson Street, San Francisco, CA">Montg
             <option value="Powell BART Station, Market St and Powell St, San Francis</pre>
In [586]:
               data=pd.read csv('https://raw.githubusercontent.com/Xiao-Wang-UCSD/dat
               data['Destination Name']=data['Destination Name'].replace({'2nd Street
            2
            3
            4
              column name=['AM Mean Travel Time', 'AM Range - Lower',
            5
                      'AM Range - Upper', 'PM Mean Travel Time',
                      'PM Range - Lower Bound Travel Time',
            6
            7
                      'PM Range - Upper Bound Travel Time', 'Midday Mean Travel Time'
                      'Midday Range - Lower', 'Midday Range - Upper',
            8
            9
                      'Evening Mean Travel Time', 'Evening Range - Lower',
           10
                      'Evening Range - Upper', 'Early Morning Mean Travel Time',
           11
                      'Early Morning Range - Lower', 'Early Morning Range - Upper']
               for i in column name:
           12
           13
                   data=cleaning2(data,i)
           14
In [ ]:
In [576]:
            1
               datal=data[['Origin Name','Destination Name','AM Mean Travel Time','PM
            2
              name=list(data1.groupby(['Origin Name','Destination Name','weekday']).
               frame=data1.groupby(['Origin Name','Destination Name','weekday']).mean
            3
In [577]:
               frame=frame.reset index()
            1
               frame['weekday']=frame['weekday'].replace({0:'Mon',1:'Tues',2:'Wed',3:
In [578]:
               # temp = frame.reset index()
               # temp = temp.groupby('Origin Name')[['Destination Name','AM Mean Trav
            2
            3
               # temp
            4
```

In [579]:	1	frame							
		Francisco	St, San Fe	weekuay	Travel Time	Travel Time	Time	Time	M
	7	2nd Street and Stevenson Street, San Francisco	Oracle Park, 24 Willie Mays Plaza, San Francis	Mon	443.320000	586.480000	537.400000	411.080000	3
	8	2nd Street and Stevenson Street, San Francisco	Oracle Park, 24 Willie Mays Plaza, San Francis	Tues	467.769231	657.961538	526.461538	443.615385	3
	9	2nd Street and Stevenson Street, San Francisco	Oracle Park, 24 Willie Mays Plaza, San Francis	Wed	512.153846	696.769231	584.884615	451.423077	3

```
In []: 1
In [580]: 1 a=frame['Origin Name'].unique()
2 b=frame['Destination Name'].unique()
3 c=['Mon','Tues','Wed','Thur','Fri','Sat','Sun']
```

```
In [581]:
               dict={}
            2
               for aa in a:
            3
                    dict[aa]={}
            4
                    for bb in b:
            5
                        dict[aa][bb]={}
                        for cc in c:
            6
            7
                            dict[aa][bb][cc]=0
            8
            9
           10
               dict
           11
```

```
Out[581]: {'2nd Street and Stevenson Street, San Francisco, CA': {"Fisherman's Whar
          f, 286-298 Jefferson St, San Francisco, CA": {'Mon': 0,
              'Tues': 0,
              'Wed': 0,
              'Thur': 0,
              'Fri': 0,
              'Sat': 0,
              'Sun': 0},
             'Oracle Park, 24 Willie Mays Plaza, San Francisco, CA': {'Mon': 0,
              'Tues': 0,
              'Wed': 0,
              'Thur': 0,
              'Fri': 0,
              'Sat': 0,
              'Sun': 0},
             'The Palace Of Fine Arts, 3601 Lyon St, San Francisco, CA': {'Mon': 0,
              'Tues': 0,
              'Wed': 0,
              'Thur': 0,
```

```
In [582]:
            2
               for inx in range(frame.shape[0]):
            3
                   dict[frame.iloc[inx,0]][frame.iloc[inx,1]][frame.iloc[inx,2]]=list
            4
            5
               dict
               689.6538461538462,
               511.38461538461536],
              'Wed': [875.3076923076923,
               961.7307692307693,
               782.8076923076923,
               708.9615384615385,
               529.7307692307693],
              'Thur': [931.9615384615385,
               981.7307692307693,
               814.7692307692307,
               749.5,
               512.9230769230769],
              'Fri': [860.1923076923077,
               950.9230769230769,
               860.0384615384615,
               753.7692307692307,
               543.8461538461538],
              'Sat': [668.3846153846154,
               875.2692307692307,
               022 7207602207602
In [ ]:
In [583]:
            1
               import json
            2
            3
              t=json.dumps(dict,indent=5)
               with open("mean.json", "w") as outfile:
            5
                   outfile.write(t)
```

2 machine learning

```
In [741]:
            1
               data=pd.read csv('https://raw.githubusercontent.com/Xiao-Wang-UCSD/dat
            2
               data['month'] = data['Date'].apply(lambda a:pd.to_datetime(a).month)
            3
            4
               column name=['AM Mean Travel Time', 'AM Range - Lower',
            5
                      'AM Range - Upper', 'PM Mean Travel Time',
                      'PM Range - Lower Bound Travel Time',
            6
            7
                      'PM Range - Upper Bound Travel Time', 'Midday Mean Travel Time'
            8
                      'Midday Range - Lower', 'Midday Range - Upper',
            9
                      'Evening Mean Travel Time', 'Evening Range - Lower',
                      'Evening Range - Upper', 'Early Morning Mean Travel Time',
           10
                      'Early Morning Range - Lower', 'Early Morning Range - Upper']
           11
           12
               for i in column name:
           13
                   data=cleaning2(data,i)
           14
```

```
data['month']=data['month'].apply(lambda a: a+1)
In [742]:
             1
             2
In [743]:
                # data1=data[['Origin Name', 'Destination Name', 'AM Mean Travel Time',
             1
             2
             3
               # datal=data[['Origin Name', 'Destination Name', 'AM Mean Travel Time',
             4
             5
               data['Destination Name']=data['Destination Name'].replace({'2nd Street
             6
             7
               data['Origin Name']=data['Origin Name'].replace({'2nd Street and Steve
             8
               # data.to csv('out.csv')
             9
           10
           11
In [744]:
               neww=pd.DataFrame([])
               for i in range(data.shape[0]):
             2
             3
                    neww=neww.append(data[['Date']].loc[[i,i,i,i,i ] ])
             4
               neww
              0 2019-06-09
              0 2019-06-09
              0 2019-06-09
              0 2019-06-09
              1 2019-04-28
              1 2019-04-28
              1 2019-04-28
              1 2019-04-28
              1 2019-04-28
              2 2019-05-18
              2 2019-05-18
              2 2019-05-18
              2 2019-05-18
```

```
In [745]:
              new=pd.DataFrame([])
            2
               for i in range(data1.shape[0]):
            3
                   print(i)
            4
                   each_row=data1.iloc[i,:].to_frame().transpose()
            5
                   interval=list(each_row.iloc[0,2:7])
            6
                   nkm=data1.loc[[i,i,i,i,i]]
            7
                   nkm['result']=interval
            8
                   nkm=nkm.drop(['AM Mean Travel Time','PM Mean Travel Time','Midday
            9
                   nkm['interval']=[0,1,2,3,4]
           10
                   nkm=nkm.reset_index(drop=True)
           11
                   new=new.append(nkm)
           12
              new.head()
           13
           14
               # for i in range(data1.shape[0]):
           15
```

```
In [746]:
              1
                 new=new.reset index(drop=True)
              2
                 new
                                                                                   1000.000000
                 υ
                      3601 Lyon St, San Fra...
                                                     Francisco, CA
                      The Palace Of Fine Arts,
                                                  Embarcadero, San
                                                                                   1252.000000
                 1
                      3601 Lyon St, San Fra...
                                                     Francisco, CA
                                                  Embarcadero, San
                      The Palace Of Fine Arts,
                 2
                                                                                   1398.500000
                                                                                                    2
                                                                         6
                      3601 Lyon St, San Fra...
                                                     Francisco, CA
                      The Palace Of Fine Arts,
                                                  Embarcadero, San
                 3
                                                                                  1149.500000
                                                                                                    3
                      3601 Lyon St, San Fra...
                                                     Francisco, CA
                      The Palace Of Fine Arts,
                                                  Embarcadero, San
                                                                                   1228.000000
                 4
                                                                         6
                      3601 Lyon St, San Fra...
                                                     Francisco, CA
                                             Fisherman's Wharf, 286-
                           Embarcadero, San
                 5
                                                                                5
                                                                                   579.000000
                                                                                                    0
                                                                         6
                                             298 Jefferson St, San F...
                              Francisco, CA
                           Embarcadero, San
                                             Fisherman's Wharf, 286-
                 6
                                                                                5
                                                                                   664.000000
                                                                                                    1
                              Francisco, CA
                                             298 Jefferson St, San F...
                           Embarcadero, San
                                             Fisherman's Wharf, 286-
                 7
                                                                         6
                                                                                5
                                                                                   654.000000
                                                                                                    2
                              Francisco, CA
                                             298 Jefferson St, San F...
                           Embarcadero, San
                                             Fisherman's Wharf, 286-
                 8
                                                                                5
                                                                                                    3
                                                                         6
                                                                                   608.000000
                              Francisco, CA
                                             298 Jefferson St, San F...
In [747]:
              1
                 import math
              2
                 from sklearn.ensemble import RandomForestRegressor
              3
                 from sklearn.ensemble import GradientBoostingRegressor
              4
              5
                 def train(train df):
              6
                      train df = train df.copy()
              7
                      X_train, X_test, y_train, y_test = train_test_split(train_df.drop(
              8
                      col c3 = ['Destination Name','Origin Name','weekday','month','inte
              9
             10
                      c3 transformer = Pipeline(steps=[('onehot', OneHotEncoder())])
             11
             12
                      preproc = ColumnTransformer(transformers=[
             13
                                                                        ('c3', c3_transformer, co
             14
             15
                      pl = Pipeline(steps=[('preprocessor', preproc), ('regressor', Deci
             16
                      pl.fit(X train,y train)
             17
                      pred = pl.predict(X test)
             18
                      rms = math.sqrt(mean squared error(y test, pred))
             19
                      preds = pl.predict(train_df.drop(['result'],axis=1))
             20
                      train df['pred'] = preds
             21
                      return rms, train df
In [753]:
              1
                 # ddddd=train(new)[1]
              2
                 # neww=neww.reset index(drop=True)
              3
                 # ddddd['date']=neww['Date']
                 # ddddd.to csv('outpututtt.csv')
              4
              5
                 import statsmodels
              6
In [ ]:
```