```
import numpy as np
from sklearn import metrics
import matplotlib.pyplot as plt
from sklearn.cluster import KMeans
from sklearn.datasets import fetch 20newsgroups
from sklearn.feature extraction.text import TfidfVectorizer
from nltk.stem.snowball import SnowballStemmer
from nltk.tokenize import word tokenize, sent tokenize
import pandas as pd
df = pd.read csv("census-block-group-data.csv")
#df.drop([0], axis=0, inplace=True)
Arrival df = pd.read csv("MBTA-Bus-Arrival-Departure-Times 2023-
01.csv")
df = df.drop(columns = ['FILEID', 'STUSAB', 'SUMLEV', 'GEOCODE', 'REGION',
'DIVISION', 'STATE', 'COUNTY', 'COUSUB'])
Neighborhood df =
pd.read csv("redistricting data tract20 nbhd hhpopsize ab-1.csv")
Neighborhood df.columns = Neighborhood df.iloc[0]
# Optionally, drop the first row from the DataFrame
Neighborhood df = Neighborhood df.drop(Neighborhood df.index[0])
Bus stops = pd.read csv("MBTA Systemwide GTFS Map.csv")
Bus stops.head()
                         OBJECTID stop id
                                            stop code \
           Χ
0 -71.082754
             42.330957
                           647997
                                        1
                                                  1.0
1 -71.068787
              42.330555
                           647998
                                        10
                                                 10.0
2 -71.062911
             42.355692
                           647999
                                     10000
                                              10000.0
3 -71.076237
              42.331591
                           648000
                                     10003
                                              10003.0
4 -71.071280 42.335017
                           648001
                                     10005
                                              10005.0
                       stop name stop desc platform code platform name
   Washington St opp Ruggles St
                                        NaN
                                                      NaN
                                                                    NaN
  Theo Glynn Way @ Newmarket Sq
                                        NaN
                                                      NaN
                                                                    NaN
1
2
        Tremont St opp Temple Pl
                                        NaN
                                                      NaN
                                                                    NaN
        Albany St opp Randall St
                                        NaN
                                                      NaN
                                                                    NaN
     Albany St opp E Concord St
                                        NaN
                                                      NaN
                                                                    NaN
```

```
Sidewalk Condition Sidewalk Material
    stop lat
Current Shelter
   42.330957
                                  Good
                                                    Brick
JCD
   42.330555
                                  Good
                                                 Concrete
0
2
                                  Good
                                                 Concrete
   42.355692
3
   42.331591
                                  Good
                                                 Concrete
0
4
  42.335017
                                  Good
                                                    Brick
JCD
                      Routes Municipality 1 Neighborhood created user
   1|8|10|47|19|170|191|171
                                      BOSTON
                                                   Roxbury
                                                               DOT ADMIN
1
            9|8|10|9702|171
                                      BOSTON
                                              South Boston
                                                               DOT ADMIN
2
          193 | 192 | 43 | 191 | 55
                                      BOSTON
                                               Beacon Hill
                                                               DOT ADMIN
3
                        1 | 47
                                                               DOT ADMIN
                                      BOSTON
                                                   Roxbury
                     8 | 10 | 47
                                                 South End
                                                               DOT ADMIN
                                      BOSTON
             created date last edited user
                                                     last edited date
   2023/05/30 14:10:22+00
                                  DOT ADMIN
                                              2023/05/30 14:10:22+00
                                  DOT ADMIN
1
   2023/05/30 14:10:22+00
                                              2023/05/30 14:10:22+00
  2023/05/30 14:10:22+00
                                  DOT ADMIN
                                              2023/05/30 14:10:22+00
   2023/05/30 14:10:22+00
                                  DOT ADMIN
                                              2023/05/30 14:10:22+00
  2023/05/30 14:10:22+00
                                  DOT ADMIN
                                              2023/05/30 14:10:22+00
[5 rows x 34 columns]
Bus stops = Bus stops[["stop name","Neighborhood","Routes"]]
Bus stops.describe()
              stop name Neighborhood Routes
count
                    6879
                                 1787
                                         6046
unique
                    6082
                                    26
                                          726
        Sullivan Square
                           Dorchester
                                          230
top
                      14
                                  315
                                          115
freq
Neighborhood df = Neighborhood df.iloc[:, :7]
Neighborhood df.head()
O field concept Total: White alone Black or African American alone \
                                                                 1326
1
        Allston
                 24904
                              12536
2
                                                                  690
       Back Bay
                 18190
                              13065
```

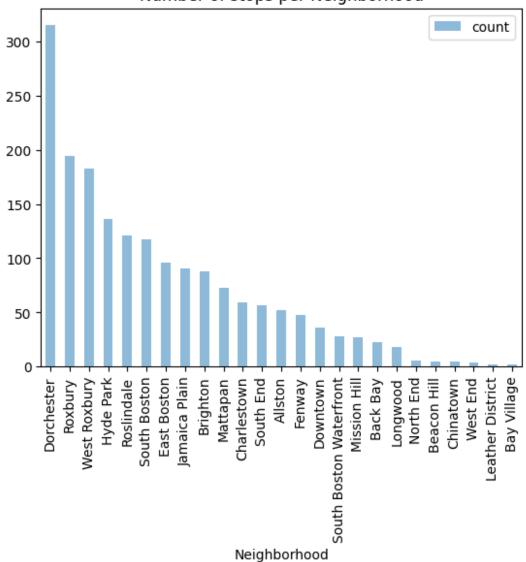
```
3
    Beacon Hill
                  9336
                              7521
                                                                252
4
       Brighton
                 52047
                             32694
                                                               2414
5
    Charlestown 19120
                             13626
                                                                990
0 Hispanic or Latino \
                3259
1
2
                1208
3
                 537
4
                5376
5
                2075
O Asian, Native Hawaiian and Pacific Islander alone, all ages \
                                                 6271
1
2
                                                 2410
3
                                                  630
4
                                                 8703
5
                                                 1650
O Other Races or Multiple Races,
                                  all ages
1
                                       1512
2
                                        817
3
                                        396
4
                                      2860
5
                                        779
Neighborhood df['Total:'] =
pd.to numeric(Neighborhood df['Total:'].str.replace(',', ''),
errors='coerce')
Neighborhood df['White alone'] = pd.to numeric(Neighborhood df['White
alone'].str.replace(',', ''), errors='coerce')
Neighborhood df['Black or African American alone'] =
pd.to numeric(Neighborhood df['Black or African American
alone'].str.replace(',', ''), errors='coerce')
Neighborhood df['Hispanic or Latino'] =
pd.to numeric(Neighborhood_df['Hispanic or Latino'].str.replace(',',
''), errors='coerce')
Neighborhood_df['Asian, Native Hawaiian and Pacific Islander alone,
all ages'] = pd.to numeric(Neighborhood df['Asian, Native Hawaiian and
Pacific Islander alone, all ages'].str.replace(',', ''),
errors='coerce')
# Neighborhood df['Other Races or Multiple Races, all ages '] =
pd.to_numeric(Neighborhood_df['Other Races or Multiple Races, all ages
'].str.replace(',', ''), errors='coerce')
Neighborhood df.head()
O field concept Total: White alone Black or African American alone
1
        Allston 24904
                               12536
                                                                  1326
```

```
2
       Back Bay
                  18190
                                13065
                                                                    690
3
    Beacon Hill
                                 7521
                                                                    252
                   9336
       Brighton
                  52047
                                32694
                                                                   2414
    Charlestown
                                                                    990
5
                  19120
                                13626
   Hispanic or Latino ∖
1
                 3259
2
                 1208
3
                  537
4
                 5376
5
                 2075
0
   Asian, Native Hawaiian and Pacific Islander alone, all ages \
1
                                                 6271
2
                                                 2410
3
                                                  630
4
                                                 8703
5
                                                 1650
O Other Races or Multiple Races, all ages
                                       1512
1
2
                                        817
3
                                        396
4
                                       2860
5
                                        779
# if Neighborhood df['Total:'].dtype == 'object':
      Neighborhood df['Total:'] =
pd.to numeric(Neighborhood df['Total:'].str.replace(',', ''),
errors='coerce')
Neighborhood Percentages df = pd.DataFrame()
Neighborhood Ints df = pd.DataFrame()
Neighborhood Percentages df["Neighborhood"] = Neighborhood df["field
concept"1
Neighborhood Percentages df["White"] = np.nan
Neighborhood Percentages df["Black"] = np.nan
Neighborhood Percentages df["Hispanic"] = np.nan
Neighborhood Percentages df["Asian, Native Hawaiian and Pacific
Islander"] = np.nan
Neighborhood Percentages df["Other"] = np.nan
Neighborhood_Ints_df["Neighborhood"] = Neighborhood_df["field
concept"1
Neighborhood Ints_df["White"] = np.nan
```

```
Neighborhood_Ints_df["Black"] = np.nan
Neighborhood Ints df["Hispanic"] = np.nan
Neighborhood Ints df["Asian, Native Hawaiian and Pacific Islander"] =
Neighborhood Ints df["Other"] = np.nan
race categories = {
    "White": "White alone",
    "Black": "Black or African American alone",
    "Hispanic": "Hispanic or Latino",
    "Asian, Native Hawaiian and Pacific Islander": "Asian, Native
Hawaiian and Pacific Islander alone, all ages",
    "Other": "Other Races or Multiple Races, all ages"
}
for i, row in Neighborhood df.iterrows():
    total population = row['Total:'] # This should be a numeric
value, not a string
    for new col, old col in race categories.items():
        if isinstance(row[old col], str):
            count = pd.to numeric(row[old col].replace(',', ''),
errors='coerce')
        else:
            count = pd.to numeric(row[old col], errors='coerce')
        percentage = (count / total population) * 100 if
total population else np.nan
        # percentage = count
        # Assign the percentage to the new DataFrame
        Neighborhood Percentages df.at[i, new col] = percentage
for i, row in Neighborhood df.iterrows():
    total population = row['Total:'] # This should be a numeric
value, not a string
    for new col, old col in race categories.items():
        if isinstance(row[old col], str):
            count = pd.to_numeric(row[old_col].replace(',', ''),
errors='coerce')
        else:
            count = pd.to numeric(row[old col], errors='coerce')
        # percentage = (count / total population) * 100 if
total population else np.nan
        percentage = count
        # Assign the percentage to the new DataFrame
        Neighborhood Ints df.at[i, new col] = percentage
```

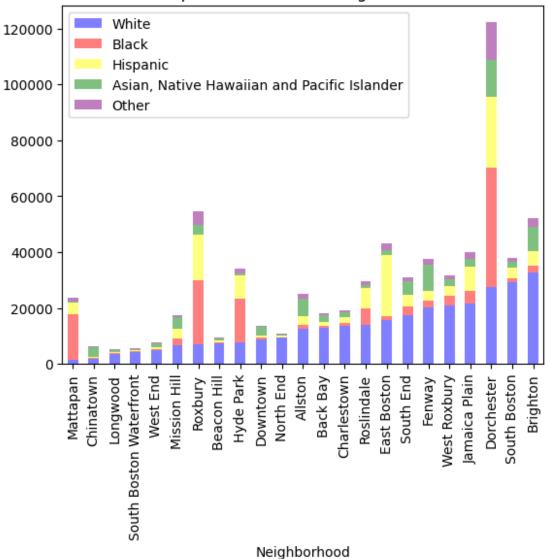
```
Bus_stops['Neighborhood'].value_counts().nlargest(25).plot(kind='bar',
legend=True, alpha=.5)
plt.title("Number of stops per Neighborhood")
plt.show()
```

Number of stops per Neighborhood

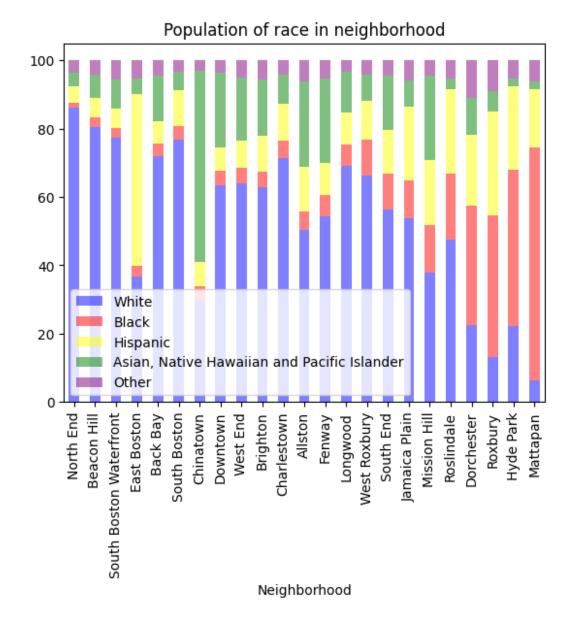


stacked_df = Neighborhood_Ints_df.sort_values(by = ["White"])
races = ["White alone", "Black or African American alone", "Hispanic
or Latino", "Asian, Native Hawaiian and Pacific Islander alone, all
ages", "Other Races or Multiple Races, all ages"]
ax = stacked_df.plot(kind = 'bar',x='Neighborhood', stacked=True,
color=['blue','red','yellow','green','purple'],legend=True, alpha=.5)
plt.title("Population of race in neighborhood")
plt.show()

Population of race in neighborhood



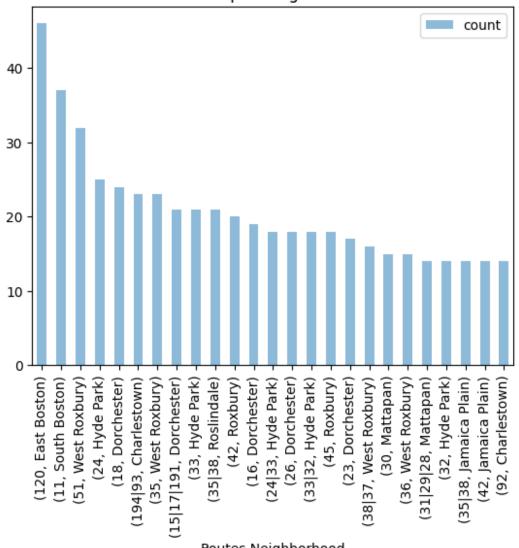
```
stacked_percentage_df = Neighborhood_Percentages_df.sort_values(by =
["Black"])
# races = ["White alone", "Black or African American alone", "Hispanic
or Latino", "Asian, Native Hawaiian and Pacific Islander alone, all
ages", "Other Races or Multiple Races, all ages" ]
ax = stacked_percentage_df.plot(kind = 'bar',x='Neighborhood',
stacked=True,
color=['blue','red','yellow','green','purple'],legend=True, alpha=.5)
plt.title("Population of race in neighborhood")
plt.show()
```



```
File
/opt/homebrew/lib/python3.11/site-packages/pandas/core/indexing.py:115
3, in _LocationIndexer.__getitem__(self, key)
   1150 axis = self.axis or 0
   1152 maybe callable = com.apply if callable(key, self.obj)
-> 1153 return self. getitem axis(maybe callable, axis=axis)
File
/opt/homebrew/lib/python3.11/site-packages/pandas/core/indexing.py:138
2, in LocIndexer. getitem axis(self, key, axis)
            if hasattr(key, "ndim") and key.ndim > 1:
   1379
   1380
                raise ValueError("Cannot index with multidimensional
key")
            return self. getitem iterable(key, axis=axis)
-> 1382
   1384 # nested tuple slicing
   1385 if is nested tuple(key, labels):
File
/opt/homebrew/lib/python3.11/site-packages/pandas/core/indexing.py:132
2, in LocIndexer. getitem iterable(self, key, axis)
   1319 self. validate key(key, axis)
   1321 # A collection of keys
-> 1322 keyarr, indexer = self._get_listlike_indexer(key, axis)
   1323 return self.obj. reindex with indexers(
   1324
            {axis: [keyarr, indexer]}, copy=True, allow dups=True
   1325 )
File
/opt/homebrew/lib/python3.11/site-packages/pandas/core/indexing.py:152
0, in LocIndexer. get listlike indexer(self, key, axis)
   1517 ax = self.obj. get axis(axis)
   1518 axis_name = self.obj._get_axis_name(axis)
-> 1520 keyarr, indexer = ax._get_indexer_strict(key, axis name)
   1522 return keyarr, indexer
File
/opt/homebrew/lib/python3.11/site-packages/pandas/core/indexes/base.py
:6114, in Index. get indexer strict(self, key, axis name)
   6111 else:
            keyarr, indexer, new indexer =
   6112
self. reindex non unique(keyarr)
-> 6114 self._raise_if_missing(keyarr, indexer, axis name)
   6116 kevarr = self.take(indexer)
   6117 if isinstance(key, Index):
   6118
           # GH 42790 - Preserve name from an Index
File
/opt/homebrew/lib/python3.11/site-packages/pandas/core/indexes/base.py
:6175, in Index. raise if missing(self, key, indexer, axis name)
```

```
6173
            if use interval msg:
   6174
                kev = list(kev)
-> 6175
            raise KeyError(f"None of [{key}] are in the
[{axis name}]")
   6177 not found = list(ensure index(key)[missing mask.nonzero()
[0]].unique())
   6178 raise KeyError(f"{not found} not in index")
KeyError: "None of [Index(['14', '70A', '19', '701', '41', '747',
'459', '448', '449', '9703'], dtype='object')] are in the [index]"
average neighborhood = merged.groupby('Routes')[['White', 'Black',
'Hispanic', 'Asian, Native Hawaiian and Pacific Islander',
'Other']].mean()
average neighborhood.head()
                 White
                            Black
                                    Hispanic \
Routes
                       24.935417 20.861718
1
             34.158051
10
             56.180430
                       10.545560 12.936837
104 | 105 | 109 71.265690
                        5.177824
                                   10.852510
109 | 104 | 105 71.265690
                         5.177824 10.852510
                         8.294805 10.838228
10 | 170
             61.395346
             Asian, Native Hawaiian and Pacific Islander
                                                              0ther
Routes
1
                                                13.038985
                                                           7.005828
                                                15.774657
                                                           4.562516
10
104 | 105 | 109
                                                 8.629707
                                                           4.074268
109 | 104 | 105
                                                 8.629707
                                                           4.074268
10 | 170
                                                14.932784
                                                           4.538837
average neighborhood = merged.groupby('Routes')['Neighborhood']
average neighborhood.value counts().nlargest(25).plot(kind='bar',
legend=True, alpha=.5)
plt.title("Routes per Neighborhood")
plt.show()
```

Routes per Neighborhood



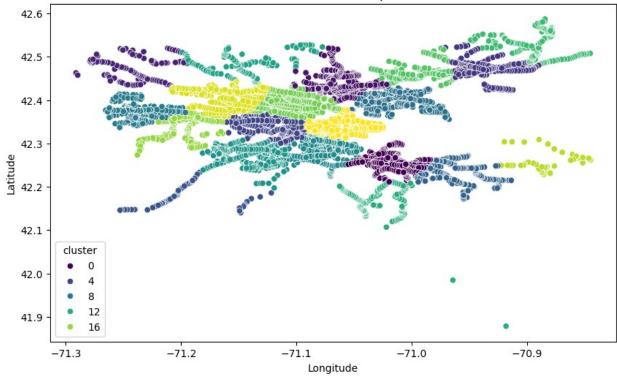
Routes, Neighborhood

```
worst on time routes = ['14', '70A', '19', '701', '41', '747', '459',
'448', '449', '9703']
worst routes neighborhood =
average neighborhood.loc[worst_on_time_routes]
NameError
                                           Traceback (most recent call
last)
Cell In[23], line 3
      1 worst on time routes = ['14', '70A', '19', '701', '41', '747',
'459', '448', '449', '9703']
----> 3 worst routes neighborhood =
```

```
average neighborhood.loc[worst on time routes]
NameError: name 'average neighborhood' is not defined
import pandas as pd
# Replace 'your dataset.csv' with the path to your dataset file
Bus_map = pd.read_csv("MBTA_Systemwide GTFS Map.csv")
Bike map = pd.read csv("current bluebikes stations.csv")
# Check the first few rows of the dataframe
#adjust first row
Bike_map.columns = Bike map.iloc[0]
Bike map = Bike map.drop(Bike map.index[0])
Bike map.head()
0 Number
                                                     Latitude
                                            Name
Longitude \
1 K32015
                                 1200 Beacon St 42.34414899
71.11467361
2 W32006
                                     160 Arsenal 42.36466403
71.17569387
3 A32019
                               175 N Harvard St 42.36447457 -
71.12840831
4 S32035
                                   191 Beacon St 42.38032335
71.10878613
5 C32094 2 Hummingbird Lane at Olmsted Green
                                                     42.28887
71.095003
     District Public Total docks Deployment Year
0
    Brookline
                                              2021
1
                  Yes
                                1
2
    Watertown
                  Yes
                               11
                                              2021
3
                  Yes
                               17
                                              2014
       Boston
4
  Somerville
                  Yes
                               19
                                              2018
                               17
       Boston
               Yes
                                              2020
Bus map['latitude'] = pd.to numeric(Bus map['stop lat'],
errors='coerce')
Bus map['longitude'] = pd.to numeric(Bus map['stop lon'],
errors='coerce')
Bike map['latitude'] = pd.to numeric(Bike map['Latitude'],
errors='coerce')
Bike map['longitude'] = pd.to numeric(Bike map['Longitude'],
errors='coerce')
# Drop rows with missing or invalid values
Bus_map.dropna(subset=['latitude', 'longitude'], inplace=True)
Bike_map.dropna(subset=['latitude', 'longitude'], inplace=True)
```

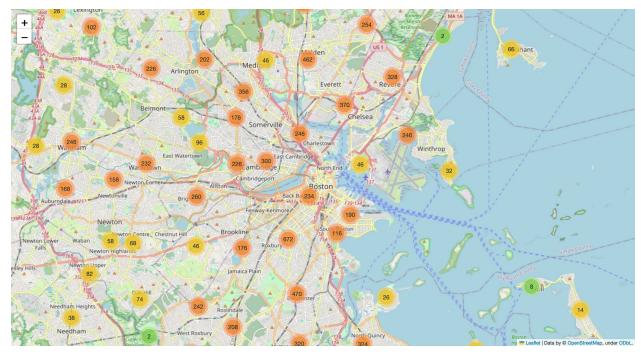
```
from sklearn.cluster import KMeans
# Number of clusters
k = 20 # You can choose a different number based on your analysis
# Selecting the features (latitude and longitude)
features = Bus_map[['latitude', 'longitude']]
# Running KMeans
kmeans = KMeans(n clusters=k, random state=0).fit(features)
# Adding cluster labels to your original dataframe
Bus map['cluster'] = kmeans.labels
/opt/homebrew/lib/python3.11/site-packages/sklearn/cluster/
_kmeans.py:1416: FutureWarning: The default value of `n init` will
change from 10 to 'auto' in 1.4. Set the value of `n init` explicitly
to suppress the warning
 super(). check params vs input(X, default n init=10)
# Number of clusters
k = 20 # You can choose a different number based on your analysis
# Selecting the features (latitude and longitude)
features bike = Bike map[['latitude', 'longitude']]
# Running KMeans
kmeans bike = KMeans(n clusters=k, random state=0).fit(features bike)
# Adding cluster labels to your original dataframe
Bike map['cluster'] = kmeans bike.labels
/opt/homebrew/lib/python3.11/site-packages/sklearn/cluster/
kmeans.py:1416: FutureWarning: The default value of `n init` will
change from 10 to 'auto' in 1.4. Set the value of `n init` explicitly
to suppress the warning
  super(). check params vs input(X, default n init=10)
import matplotlib.pyplot as plt
import seaborn as sns
# Plotting
plt.figure(figsize=(10, 6))
sns.scatterplot(data=data, x='longitude', y='latitude', hue='cluster',
palette='viridis')
plt.title('Clustered Bus and Train Stops in Boston')
plt.xlabel('Longitude')
plt.ylabel('Latitude')
plt.show()
```

Clustered Bus and Train Stops in Boston



```
# Do not edit this cell
import pandas as pd
import numpy as np
import folium #install if you haven't already
import selenium #install if you haven't already
from IPython.display import Image #install if you haven't already
def convert map to png(map, filename):
    Method to convert a folium map to a png file by
    saving the map as an html file and then taking a
    screenshot of the html file on the browser.
    map : folium map object
        The map to be converted to a png file
    filename : str, does not include file type
    import os
    import time
    from selenium import webdriver
    html filename=f'{filename}.html'
    map.save(html_filename)
    tmpurl=f'file://{os.getcwd()}/{html filename}'
```

```
try:
        try:
            browser = webdriver.Firefox()
        except:
            browser = webdriver.Chrome()
    except:
        browser = webdriver.Safari()
    browser.get(tmpurl)
    time.sleep(5)
    browser.save screenshot(f'{filename}.png')
    browser.quit()
    os.remove(html filename)
    return Image(f'{filename}.png')
import folium
import pandas as pd
from folium.plugins import FastMarkerCluster
# Initialize the map at a central point in Boston
boston map = folium.Map(location=[42.3601, -71.0589], zoom start=12)
# Latitude and longitude of Boston
# Load your dataset here
bus train stops = Bus map
# Create a FastMarkerCluster
marker cluster = FastMarkerCluster(data=bus train stops[['latitude',
'longitude']].values.tolist()).add to(boston map)
# Add popup (optional, customize as needed)
for , stop in bus train stops.iterrows():
    popup = f"{stop['stop name']}" # Assuming your dataset has a
column 'stop name'
    folium.Marker((stop['latitude'], stop['longitude']),
popup=popup).add to(marker cluster)
# Save map
boston map.save("bus train stops clusters.html")
# The function `convert_map_to_png` is not a standard function and
would need to be defined if you wish to use it.
# convert_map to_png(boston map, 'boston bus train stops')
convert_map_to_png(boston_map, 'Boston_Bus_stops')
```



```
import folium
import pandas as pd
from folium.plugins import FastMarkerCluster
# Initialize the map at a central point in Boston
boston_map = folium.Map(location=[42.3601, -71.0589], zoom start=12)
# Latitude and longitude of Boston
# Load your dataset here
bike stops = Bike map
# Create a FastMarkerCluster
marker cluster = FastMarkerCluster(data=bike stops[['latitude',
'longitude']].values.tolist()).add to(boston map)
# Add popup (optional, customize as needed)
for _, stop in bike stops.iterrows():
    popup = f"{stop['District']}"
    folium.Marker((stop['Latitude'], stop['Longitude']),
popup=popup).add to(marker cluster)
# Save map
boston_map.save("bus_train_stops_clusters.html")
# The function `convert map to png` is not a standard function and
would need to be defined if you wish to use it.
# convert map to png(boston map, 'boston bus train stops')
convert_map_to_png(boston_map, 'Boston_Bike stations')
```

