

This is just an initial block to insert an intor

In []:

```
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
```

In []:

```
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_hhpopsizes_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")
```

In []:

```
Bus_stops.head()
```

Out[]:

| | X | Y | OBJECTID | stop_id | stop_code | stop_name | stop_desc | platform_code | platform_name | stop_lat | .. |
|---|-----------|-----------|----------|---------|-----------|-------------------------------|-----------|---------------|---------------|-----------|----|
| 0 | 71.082754 | 42.330957 | 647997 | 1 | 1.0 | Washington St opp Ruggles St | NaN | NaN | NaN | 42.330957 | .. |
| 1 | 71.068787 | 42.330555 | 647998 | 10 | 10.0 | Theo Glynn Way @ Newmarket Sq | NaN | NaN | NaN | 42.330555 | .. |
| 2 | 71.062911 | 42.355692 | 647999 | 10000 | 10000.0 | Tremont St opp Temple Pl | NaN | NaN | NaN | 42.355692 | .. |
| 3 | 71.076237 | 42.331591 | 648000 | 10003 | 10003.0 | Albany St opp Randall St | NaN | NaN | NaN | 42.331591 | .. |
| 4 | 71.071280 | 42.335017 | 648001 | 10005 | 10005.0 | Albany St opp E Concord St | NaN | NaN | NaN | 42.335017 | .. |

5 rows x 34 columns



In []:

```
Bus_stops = Bus_stops[["stop_name", "Neighborhood", "Routes"]]
Bus_stops.describe()
```

Out[]:

| | stop_name | Neighborhood | Routes |
|--------|-----------------|--------------|--------|
| count | 6879 | 1787 | 6046 |
| unique | 6082 | 26 | 726 |
| top | Sullivan Square | Dorchester | 230 |
| freq | 14 | 315 | 115 |

In []:

```
Neighborhood_df = Neighborhood_df.iloc[:, :7]

Neighborhood_df.head()
```

Out[]:

| | field concept | Total: | 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 |
|---|---------------|--------|-------------|---------------------------------|--------------------|---|---|
| 1 | Allston | 24904 | 12536 | 1326 | 3259 | 6271 | 1512 |
| 2 | Back Bay | 18190 | 13065 | 690 | 1208 | 2410 | 817 |
| 3 | Beacon Hill | 9336 | 7521 | 252 | 537 | 630 | 396 |
| 4 | Brighton | 52047 | 32694 | 2414 | 5376 | 8703 | 2860 |
| 5 | Charlestown | 19120 | 13626 | 990 | 2075 | 1650 | 779 |

In []:

```
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()
```

Out[]:

| | field concept | Total: | 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 |
|---|---------------|--------|-------------|---------------------------------|--------------------|---|---|
| 1 | Allston | 24904 | 12536 | 1326 | 3259 | 6271 | 1512 |
| 2 | Back Bay | 18190 | 13065 | 690 | 1208 | 2410 | 817 |
| 3 | Beacon Hill | 9336 | 7521 | 252 | 537 | 630 | 396 |
| 4 | Brighton | 52047 | 32694 | 2414 | 5376 | 8703 | 2860 |
| 5 | Charlestown | 19120 | 13626 | 990 | 2075 | 1650 | 779 |

In []:

```
# if Neighborhood_df['Total:'].dtype == 'object':
#     Neighborhood_df['Total:'] = pd.to_numeric(Neighborhood_df['Total:'].str.replace(',', ' '), errors='coerce')

Neighborhood_Percents_df = pd.DataFrame()
Neighborhood_Ints_df = pd.DataFrame()

Neighborhood_Percents_df["Neighborhood"] = Neighborhood_df["field concept"]
```

```

Neighborhood_Percents_df["White"] = np.nan
Neighborhood_Percents_df["Black"] = np.nan
Neighborhood_Percents_df["Hispanic"] = np.nan
Neighborhood_Percents_df["Asian, Native Hawaiian and Pacific Islander"] = np.nan
Neighborhood_Percents_df["Other"] = np.nan

Neighborhood_Ints_df["Neighborhood"] = Neighborhood_df["field concept"]
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"] = np.nan
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 Is
lander 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_Percents_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

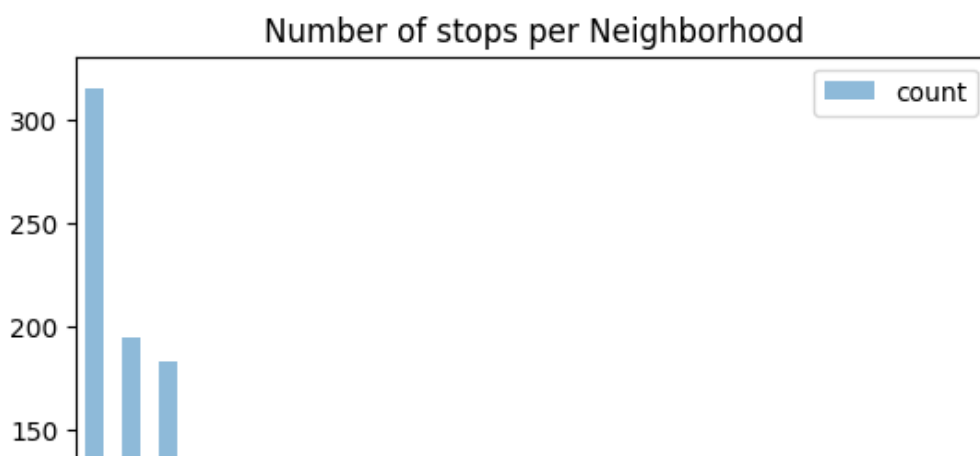
```

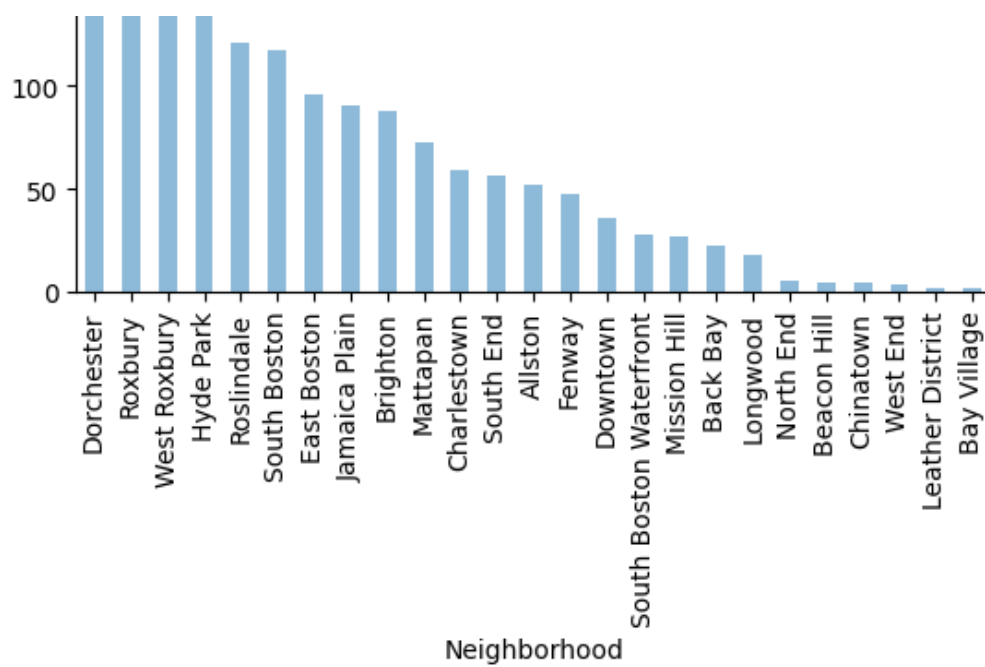
In []:

```

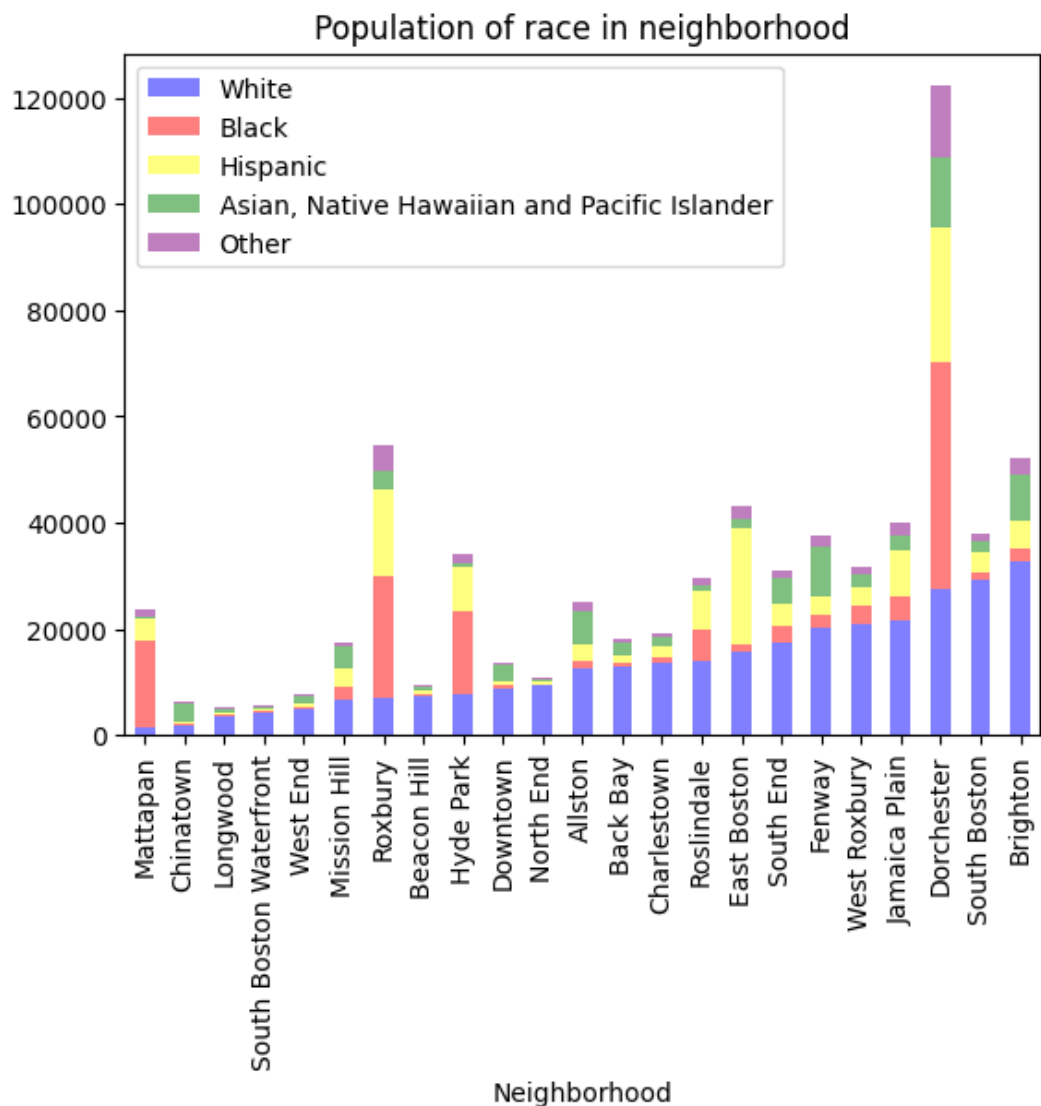
Bus_stops['Neighborhood'].value_counts().nlargest(25).plot(kind='bar', legend=True, alph
a=.5)
plt.title("Number of stops per Neighborhood")
plt.show()

```



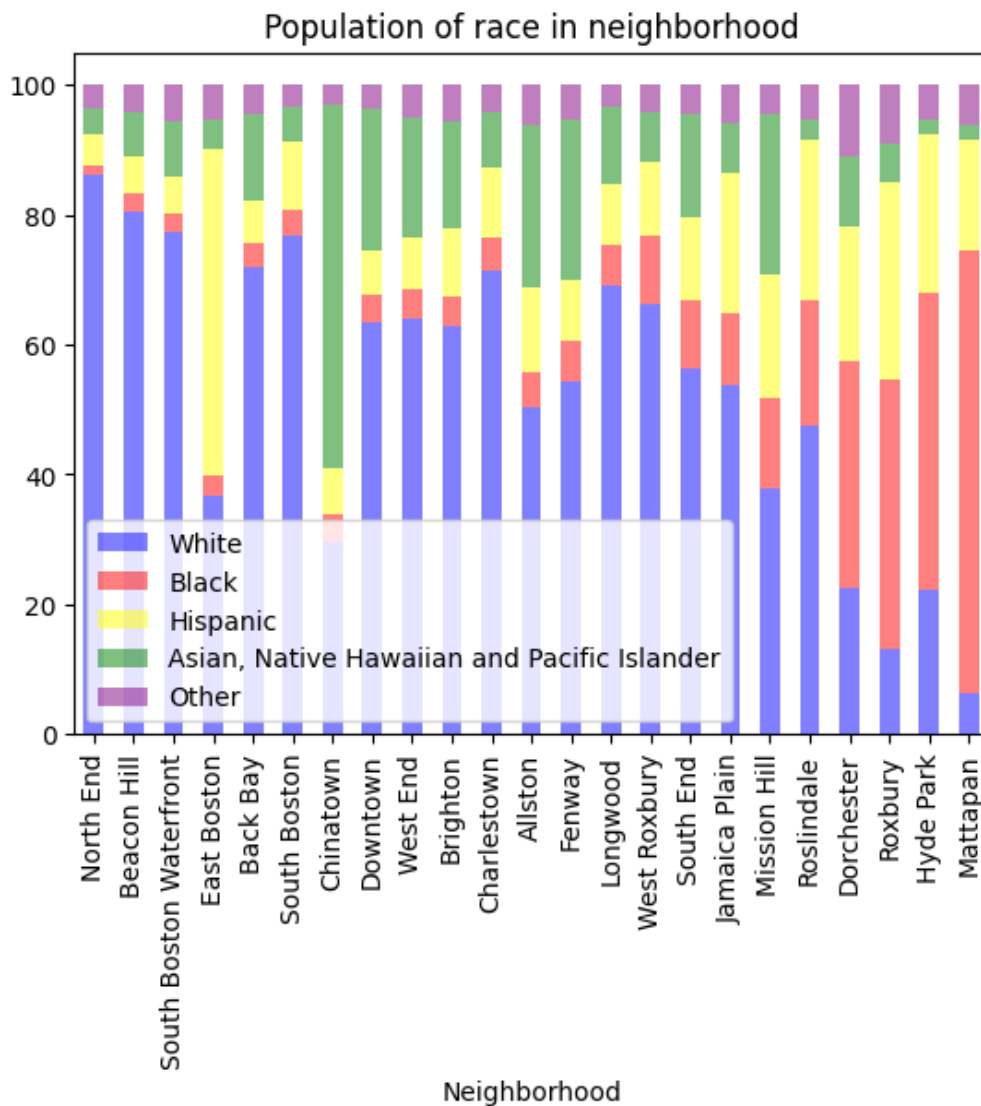


```
In [ ]:
stacked_df = Neighborhood_Ints_df.sort_values(by = ["White"])
# races = ["White alone", "Black or African American alone", "Hispanic or Latino", "Asian,
Native Hawaiian and Pacific Islander alone, all ages", "Other Races or Multiple Races, a
ll ages" ]
ax = stacked_df.plot(kind = 'bar',x='Neighborhood',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



```
In [ ]:
```

```
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, a
ll ages" ]
ax = stacked_percentage_df.plot(kind = 'bar', x='Neighborhood', stacked=True, color=['blu
e', 'red', 'yellow', 'green', 'purple'], legend=True, alpha=.5)
plt.title("Population of race in neighborhood")
plt.show()
```



```
In [ ]:
```

```
Bus_stops = Bus_stops.loc[worst_on_time_routes]
merged = pd.merge(Bus_stops, Neighborhood_Percentages_df, left_on='Neighborhood', right_
on='Neighborhood')
merged.head()
```

```
-----
KeyError                                Traceback (most recent call last)
Cell In[68], line 1
----> 1 Bus_stops = Bus_stops.loc[worst_on_time_routes]
      2 merged = pd.merge(Bus_stops, Neighborhood_Percentages_df, left_on='Neighborhood',
right_on='Neighborhood')
      3 merged.head()

File /opt/homebrew/lib/python3.11/site-packages/pandas/core/indexing.py:1153, in _Locatio
nIndexer._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:1382, in _LocInde
xer._getitem_axis(self, key, axis)
    1379 if hasattr(key, "ndim") and key.ndim > 1:
    1380     raise ValueError("Cannot index with multidimensional key")
```

```

1380         raise ValueError("Cannot index with multidimensional key")
-> 1382         return self.getitem_iterable(key, axis=axis)
1384 # nested tuple slicing
1385 if is_nested_tuple(key, labels):

File /opt/homebrew/lib/python3.11/site-packages/pandas/core/indexing.py:1322, 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:1520, 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:
6112     keyarr, indexer, new_indexer = self._reindex_non_unique(keyarr)
-> 6114 self.raise_if_missing(keyarr, indexer, axis_name)
6116 keyarr = 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         key = list(key)
-> 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]"

```

In []:

```

average_neighborhood = merged.groupby('Routes')[['White', 'Black', 'Hispanic', 'Asian, Native Hawaiian and Pacific Islander', 'Other']].mean()
average_neighborhood.head()

```

Out[]:

| | White | Black | Hispanic | Asian, Native Hawaiian and Pacific Islander | Other |
|-----------|-----------|-----------|-----------|---|----------|
| Routes | | | | | |
| 1 | 34.158051 | 24.935417 | 20.861718 | 13.038985 | 7.005828 |
| 10 | 56.180430 | 10.545560 | 12.936837 | 15.774657 | 4.562516 |
| 104105109 | 71.265690 | 5.177824 | 10.852510 | 8.629707 | 4.074268 |
| 109104105 | 71.265690 | 5.177824 | 10.852510 | 8.629707 | 4.074268 |
| 101170 | 61.395346 | 8.294805 | 10.838228 | 14.932784 | 4.538837 |

In []:

```

average_neighborhood = merged.groupby('Routes')['Neighborhood']

```

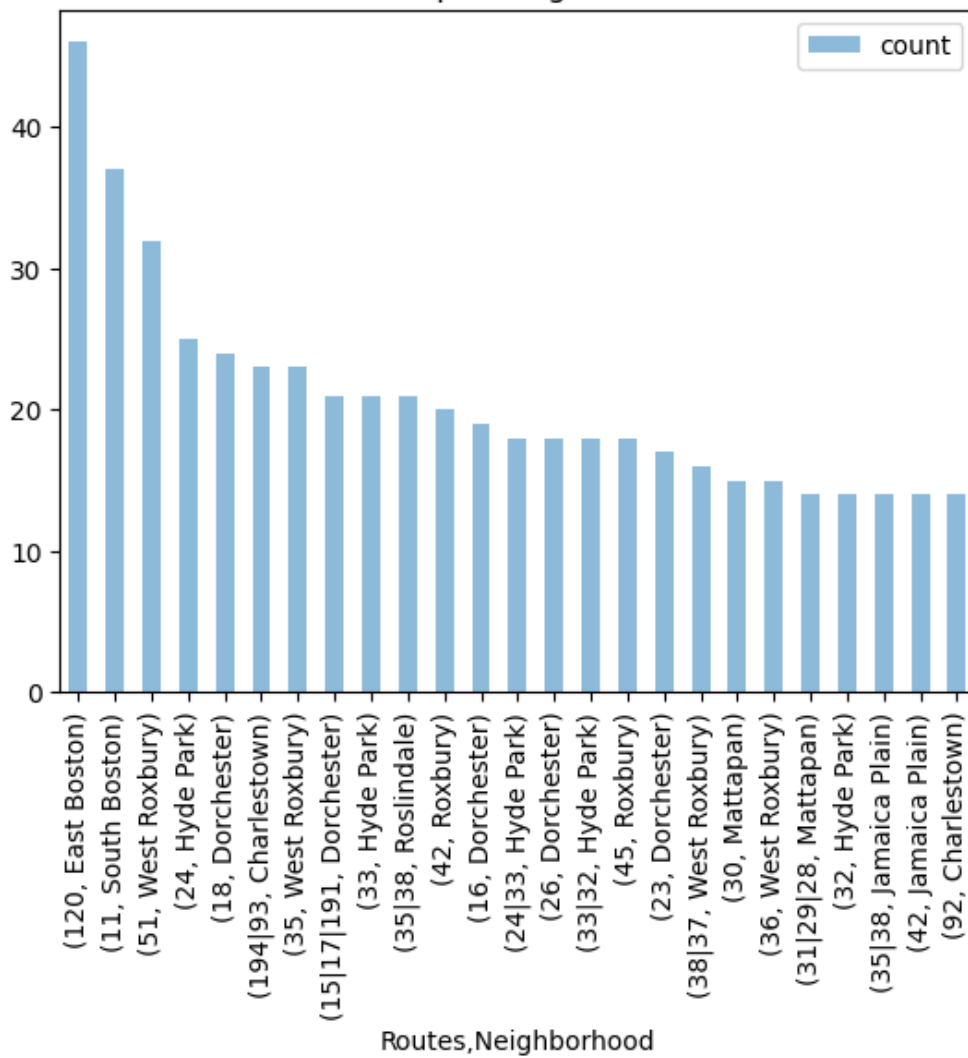
In []:

```

average_neighborhood.value_counts().nlargest(25).plot(kind='bar', legend=True, alpha=.5)
plt.title("Routes per Neighborhood")
plt.show()

```

Routes per Neighborhood



In [1]:

```
# worst_on_time_routes = ['14', '70A', '19', '701', '41', '747', '459', '448', '449', '9703']

# worst_routes_neighborhood = average_neighborhood.loc[worst_on_time_routes]
```

In []: