Rigs Question 1: Some viles required for preprocessing have been excluded as they require more thatn 100 mb space

What are the trends regarding student housing across the city, by district, e.g. what % of the rental housing is taken up by students for each district and how has this changed over time?

```
In [1]: import numpy as np
        import pandas as pd
        import matplotlib.pyplot as plt
        import re
In [2]: boston_wards = {
            1: "East Boston",
            2: "Charlestown",
            3: "North End, West End, Financial District, Chinatown",
            4: "Fenway, South End, Back Bay",
            5: "Back Bay, Beacon Hill",
            6: "South Boston",
            7: "South Boston, Dorchester",
            8: "South End, Roxbury",
            9: "South End, Roxbury",
            10: "Mission Hill",
            11: "Roxbury, Jamaica Plain",
            12: "Roxbury",
            13: "Dorchester, Savin Hill",
            14: "North Dorchester, Mattapan",
            15: "Dorchester, Meeting Hill House",
            16: "Dorchester (Neponset Cedar Grove)",
            17: "Dorchester (Lower Mills)",
            18: "Hyde Park, Mattapan",
            19: "Jamaica Plain, Roslindale",
            20: "West Roxbury",
            21: "Allston, Brighton",
            22: "Unknown or Newer Areas"
In [3]: # Load data, ready for cleaning and drop obvious not needed columsn
        df = pd.read_csv('StudentAddresses(UP).csv', low_memory=False)
        df = df.drop(columns=['6d. unit #'])
        df = df.drop(columns=['9. at-home or not-at-home'])
        df['full_address'] = df['6a. street #'].astype(str) + ' ' + \
                             df['6b. street name'] + ' ' + \
                             df['6c. street suffix'] + ', ' + \
                             df['6e. zip'].astype(str)
        df['full address'] = df['6a. street #'].astype(str) + ' ' + \
```

Out[3]:

	6a. street #	6b. street name	6c. street suffix	6e. zip	7. undergraduate (u) or graduate (g)	8. full-time (ft) or part-time (pt)	9. 5 or more undergrads/unit (y/n)	unive
0	10	Higgins	ST	2134	U	FT	NaN	Emma Co
1	10	Higgins	ST	2134	U	FT	NaN	Emma Co
2	1189	Commonwealth	AVE	2134	U	FT	NaN	Emma Co
3	12	Glenville	AVE	2134	U	FT	NaN	Emma Co
4	12	Glenville	AVE	2134	U	FT	NaN	Emma Co
•••								
95	58	Queensberry	ST	2215	U	FT	NaN	Emma Co
96	58	Queensbury	ST	2215	U	FT	NaN	Emma Co
97	660	Washington	ST	2111	U	FT	NaN	Emma Co
98	660	Washington	ST	2111	U	FT	NaN	Emma Co
99	69	Park	DR	2215	U	FT	NaN	Emma Co

100 rows \times 12 columns

Ward assignment

```
In [4]: ## Exmapnstion of location to get full set for comparison
        lookup df = pd.read csv('../location.csv')
        lookup df.head()
        count = 0
        expanded_rows = [] # sotre the new row
        error rows = [] # store the error rows
        for _, row in lookup_df.iterrows():
            if row['IS RANGE'] == 1:
                # integer conversion of rows range
                    range from = int(float(row['RANGE FROM']))
                    range to = int(float(row['RANGE TO']))
                except ValueError:
                    # print(row["RANGE_FROM"], row["RANGE_TO"])
                    count += 1
                    error_rows.append(row)
                    continue # invalid range indexing
                # enumerate through the entire range and create rows for each number
                for num in range(range_from, range_to + 1):
                    new row = row.copy()
                    new row['STREET NUMBER'] = str(num)
                    new_row['FULL_ADDRESS'] = f"{num} {row['FULL_STREET_NAME']}"
                    expanded rows.append(new row)
            else:
                # if not a range, just append the row as-is
                expanded rows.append(row)
        # Convert the expanded rows back into a DataFrame
        expanded lookup df = pd.DataFrame(expanded rows).reset index(drop=True)
        print("The error count is: ", count)
        # Standardize street number and full street name to create a properly format
        expanded lookup df['actual address'] = expanded lookup df['STREET NUMBER'].a
        expanded_lookup_df.head(100)
        ## PS: there are a total of 2591 range errors since they are not indexed wit
        ## This error list will also be checked to see if they are in the error list
       /var/folders/vt/h6zk5t3106dgbrm4lvpjm5x40000gn/T/ipykernel_78572/1595117873.
       py:3: DtypeWarning: Columns (6,7,15,23,24) have mixed types. Specify dtype o
       ption on import or set low_memory=False.
         lookup_df = pd.read_csv('../location.csv')
       The error count is: 2591
```

Out[4]:		SAM_ADDRESS_ID	BUILDING_ID	RELATIONSHIP_TYPE	FULL_ADDRESS	STREET_
	0	1	100778	1	6 A St	
	1	1	100778	1	7 A St	
	2	1	100778	1	8 A St	
	3	1	100778	1	9 A St	
	4	1	100778	1	10 A St	
	•••					
	95	56	175978	1	82 A St	
	96	57	175978	2	80 A St 5	
	97	58	175978	2	80 A St 6	
	98	59	180953	1	84 A St	
	99	59	180953	1	85 A St	

100 rows × 30 columns

In [5]: book.head()

8.

Out[5]:

```
full-
                                                          7.
                                                              time
              6a.
                                                                       9. 5 or more
                                    6c.
                       6b. street
                                              undergraduate
                                                               (ft)
                                          6e.
            street
                                  street
                                                                    undergrads/unit univers
                           name
                                          aiz
                                                       (u) or
                                                                or
                                  suffix
                                                                              (y/n)
                                                             part-
                                                 graduate (g)
                                                              time
                                                               (pt)
                                                                                    Emman
         0
               10
                                    ST 2134
                                                          U
                                                                FT
                                                                               NaN
                         Higgins
                                                                                      Colle
                                                                                    Emman
         1
               10
                                                          U
                                                                FT
                         Higgins
                                    ST 2134
                                                                               NaN
                                                                                      Colle
                                                                                    Emman
         2
                   Commonwealth
                                   AVE 2134
                                                          U
                                                                FT
                                                                               NaN
             1189
                                                                                      Colle
                                                                                    Emman
         3
               12
                         Glenville
                                   AVE 2134
                                                          U
                                                                FT
                                                                               NaN
                                                                                      Colle
                                                                                    Emman
         4
               12
                         Glenville
                                   AVE 2134
                                                          U
                                                                FT
                                                                               NaN
                                                                                      Colle
In [8]:
        book['real address'] = (
             book['6a. street #'].astype(str) # Convert street number to string
             + book['6b. street name'].fillna('').astype(str) # Ensure street name i
             + book['6c. street suffix'].fillna('').astype(str) # Ensure street suff
         )
         # Normalize by removing spaces, full stops, and converting to lowercase
         book['real address'] = (
             book['real address']
             .str.replace(r'\s+', '', regex=True)
                                                     # Remove all spaces
             .str.replace(r'\.$', '', regex=True)
                                                     # Remove trailing full stops
             .str.lower() # Convert to lowercase
         print(book[['6a. street #', '6b. street name', '6c. street suffix', 'real ad
         6a. street # 6b. street name 6c. street suffix
                                                                     real address
       0
                                Higgins
                                                                      10higginsst
                    10
                                                         ST
       1
                    10
                                Higgins
                                                         ST
                                                                      10higginsst
       2
                  1189
                           Commonwealth
                                                        AVE
                                                             1189commonwealthave
       3
                              Glenville
                                                                  12glenvilleave
                    12
                                                        AVE
       4
                    12
                              Glenville
                                                        AVE
                                                                  12glenvilleave
       5
                    12
                               Saunders
                                                         ST
                                                                     12saundersst
                  1251
       6
                           Commonwealth
                                                        AVE
                                                             1251commonwealthave
       7
                               Highgate
                                                         ST
                                                                    17highgatest
                    17
       8
                                                         ST
                    28
                                 Linden
                                                                       28lindenst
       9
                    28
                                  Ouint
                                                        AVE
                                                                       28quintave
        book['real_address'] = book['real_address'].astype(str).str.strip().str.lowe
         # Create actual address by concatenating street number and full street name
        # Ensure we include the actual street name (STREET BODY)
         expanded_lookup_df['actual_address'] = (
```

Out[9]:		SAM_ADDRESS_ID	BUILDING_ID	RELATIONSHIP_TYPE	FULL_ADDRESS	STREET_
	0	1	100778	1	6 A St	
	1	1	100778	1	7 A St	
	2	1	100778	1	8 A St	
	3	1	100778	1	9 A St	
	4	1	100778	1	10 A St	
	•••					
	95	56	175978	1	82 A St	
	96	57	175978	2	80 A St 5	
	97	58	175978	2	80 A St 6	
	98	59	180953	1	84 A St	
	99	59	180953	1	85 A St	

100 rows × 31 columns

```
address to ward = expanded lookup df.set index('actual address')['WARD'].to
          address2_to_ward = expanded_lookup_df.set_index('actual2_address')['WARD'].t
          book['real address'] = book['real address'].str.rstrip('.')
          # Fast mapping using dictionary lookup (0(1) time complexity per lookup)
          print(list(address to ward.keys())[:20]) # Print first 20 keys
          print("Expected Key:", book['real_address'].iloc[0]) # Print first address
         ['6astreet', '7astreet', '8astreet', '9astreet', '10astreet', '15astreet',
        '172astreet', '173astreet', '174astreet', '176astreet', '177astreet', '178as
        treet', '21astreet', '232astreet', '249astreet', '250astreet', '251astreet',
         '252astreet', '253astreet', '254astreet']
        Expected Key: 10higginsst
In [12]:
          book['ward'] = book['real address'].map(address to ward)
          # Second mapping: Only update where ward is still NaN
          book['ward'] = book['ward'].fillna(book['real_address'].map(address2_to_ward
          book.head()
Out[12]:
                                                                 8.
                                                               full-
                                                           7.
                                                              time
                                                                        9. 5 or more
               6a.
                                     6c.
                        6b. street
                                           6e.
                                               undergraduate
                                                                (ft)
             street
                                  street
                                                                    undergrads/unit univers
                            name
                                                                 or
                                           zip
                                                       (u) or
                 #
                                   suffix
                                                                              (y/n)
                                                 graduate (g)
                                                              part-
                                                               time
                                                               (pt)
                                                                                    Emman
          0
                10
                          Higgins
                                     ST 2134
                                                           U
                                                                FT
                                                                               NaN
                                                                                       Colle
                                                                                    Emman
          1
                10
                          Higgins
                                     ST
                                         2134
                                                           U
                                                                FT
                                                                               NaN
                                                                                       Colle
                                                                                    Emman
          2
                                                           U
                                                                FT
                                                                               NaN
              1189
                    Commonwealth
                                    AVE 2134
                                                                                       Colle
                                                                                    Emman
          3
                12
                          Glenville
                                    AVE 2134
                                                           U
                                                                FT
                                                                               NaN
                                                                                       Colle
                                                                                    Emman
          4
                          Glenville
                                                           U
                                                                               NaN
                12
                                    AVE 2134
                                                                FT
                                                                                       Colle
```

```
In [13]: book.to_csv("book_with_wards.csv", index=False)
    expanded_lookup_df.to_csv("expanded_lookup.csv", index=False)
    book.head(100)
```

Out[13]:

	6a. street #	6b. street name	6c. street suffix	6e. zip	7. undergraduate (u) or graduate (g)	8. full-time (ft) or part-time (pt)	9. 5 or more undergrads/unit (y/n)	unive
0	10	Higgins	ST	2134	U	FT	NaN	Emma Co
1	10	Higgins	ST	2134	U	FT	NaN	Emma Co
2	1189	Commonwealth	AVE	2134	U	FT	NaN	Emma Co
3	12	Glenville	AVE	2134	U	FT	NaN	Emma Co
4	12	Glenville	AVE	2134	U	FT	NaN	Emma Co
•••	•••		•••	•••		•••		
95	58	Queensberry	ST	2215	U	FT	NaN	Emma Co
96	58	Queensbury	ST	2215	U	FT	NaN	Emma Co
97	660	Washington	ST	2111	U	FT	NaN	Emma Co
98	660	Washington	ST	2111	U	FT	NaN	Emma Co
99	69	Park	DR	2215	U	FT	NaN	Emma Co

100 rows × 14 columns

Further Processing

```
In [14]: # Drop rows where 'ward' is NaN (missing ward assignments)
book = book.dropna(subset=['ward']).reset_index(drop=True)
book['ward_name'] = book['ward'].astype(int).map(boston_wards)
book.to_csv("book_with_wards.csv", index=False)
expanded_lookup_df.to_csv("expanded_lookup.csv", index=False)
book.head()
```

8.

Out[14]:

univers	9. 5 or more undergrads/unit (y/n)	full- time (ft) or part- time (pt)	7. undergraduate (u) or graduate (g)	6e. zip	6c. street suffix	6b. street name	6a. street #	
Emman Colle	NaN	FT	U	2134	ST	Higgins	10	0
Emman Colle	NaN	FT	U	2134	ST	Higgins	10	1
Emman Colle	NaN	FT	U	2134	AVE	Commonwealth	1189	2
Emman Colle	NaN	FT	U	2134	AVE	Glenville	12	3
Emman Colle	NaN	FT	U	2134	AVE	Glenville	12	4

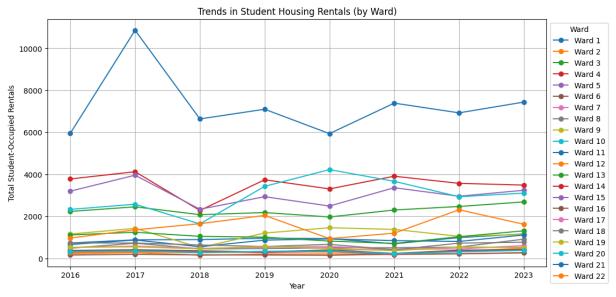
First job is to cluster the people together of the same district: (Given Book is ready:)

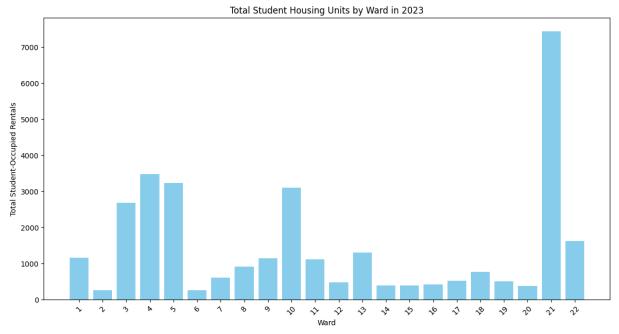
```
In [26]: import pandas as pd
         import matplotlib.pyplot as plt
         # Ensure ward and year are properly formatted
         book['ward'] = book['ward'].astype(int)
         book['year'] = book['year'].astype(str).str.extract(r'(\d{4})').astype(int)
         # Calculate student housing trends
         student_housing_trends = book.groupby(['ward', 'year']).size().reset_index(r
         # Display DataFrame
         print(student_housing_trends.head())
         # 🔷 **Visualization: Line Plot for Student Housing Trends (Total Units)**
         plt.figure(figsize=(12, 6))
         for ward in student housing trends['ward'].unique():
             subset = student_housing_trends[student_housing_trends['ward'] == ward]
             plt.plot(subset['year'], subset['student_units'], marker='o', label=f'Wa
         plt.xlabel("Year")
         plt.ylabel("Total Student-Occupied Rentals")
         plt.title("Trends in Student Housing Rentals (by Ward)")
         plt.legend(title="Ward", bbox_to_anchor=(1, 1))
         plt.grid(True)
         plt.show()
         # 🔷 **Visualization: Bar Chart for Latest Year Student Housing by Ward**
         plt.figure(figsize=(14, 7))
         latest_year = student_housing_trends['year'].max()
```

```
latest_data = student_housing_trends[student_housing_trends['year'] == lates
plt.bar(latest_data['ward'].astype(str), latest_data['student_units'], color

plt.xlabel("Ward")
plt.ylabel("Total Student-Occupied Rentals")
plt.title(f"Total Student Housing Units by Ward in {latest_year}")
plt.xticks(rotation=45)
plt.show()
```

	ward	year	student_units
0	1	2016	734
1	1	2017	883
2	1	2018	896
3	1	2019	958
4	1	2020	944





In []: # Normalize full_address and actual_address: lowercase + remove all spaces

We are going to first start by converting our address into