In [2]: import pandas as pd data=pd.read_csv("E:\Public_School_Characteristics_2020-21.csv") In [3]: data.head(10) C:\Users\SAHIL SINGH\AppData\Local\Temp\ipykernel_29428\2609331481.py:1: DtypeWarn ing: Columns (11) have mixed types. Specify dtype option on import or set low_memo ry=False. data=pd.read_csv("E:\Public_School_Characteristics_2020-21.csv") Out[3]: Χ Y OBJECTID NCESSCH SURVYEAR STABR **LEAID ST LEAID** LEA NA Albert_\ -86.206200 34.260200 10000500870 2020-2021 AL 100005 AL-101 Albert۱ -86.204900 34.262200 10000500871 2020-2021 AL 100005 AL-101 Albert_\ -86.220100 34.273300 10000500879 2020-2021 AL 100005 AL-101 Alberty -86.221806 34.252700 10000500889 2020-2021 AL 100005 AL-101 Albert۱ -86.193300 34.289800 10000501616 2020-2021 AL 100005 AL-101 Albert۱ -86.221800 34.253300 10000502150 2020-2021 AL 100005 AL-101 Mars -86.254100 34.533700 10000600193 2020-2021 AL 100006 AL-048 Cou Mars -86.142000 34.362500 10000600872 2020-2021 100006 AL-048 Cou Mars -86.270400 34.406900 10000600876 2020-2021 AL-048 100006 Cou Mars -86.321259 34.176234 10000600877 2020-2021 AL 100006 AL-048 Cou 10 rows × 79 columns

Checking for Duplicate

In [4]: data[data.duplicated()]

```
Out[4]: X Y OBJECTID NCESSCH SURVYEAR STABR LEAID ST_LEAID LEA_NAME SCH_NAME ...

0 rows × 79 columns

In [5]: data.duplicated().sum()
Out[5]: 0

No duplicates found.
```

Cleaning the Data

```
In [6]: data.isnull().values.any()
Out[6]: True

In [7]: pd.set_option('display.max_columns', None)
    pd.set_option('display.max_rows', None)
    data.isnull().sum()
```

23, 00:55		
Out[7]:	X Y	0
	OBJECTID	0
	NCESSCH	0
	SURVYEAR	0
	STABR	0
	LEAID	0
	ST LEAID	0
	LEA_NAME	0
	SCH_NAME	0
	LSTREET1	3
	LSTREET2	100144
	LCITY	0
	LSTATE	0
	LZIP	0
	LZIP4	0
	PHONE	0
	CHARTER_TEXT	0
	MAGNET_TEXT	0
	VIRTUAL	0
	GSLO GSHI	0
	SCHOOL_LEVEL	0
	TITLEI	0
	STITLEI	0
	STATUS	0
	SCHOOL_TYPE_TEXT	0
	SY_STATUS_TEXT	0
	ULOCALE	0
	NMCNTY	0
	TOTFRL	23758
	FRELCH	26605
	REDLCH	26605
	PK	69021
	KG	47185
	G01	46781
	G02	46742
	G03	46790
	G04	47000
	G05	48296
	G06	63502
	G07	68572
	G08 G09	68344 73736
	G10	73736
	G10	73903
	G12	73991
	G13	100579
	UG	92569
	AE	100540
	TOTMENROL	100722
	TOTFENROL	100722
	TOTAL	2071
	MEMBER	2071
	FTE	9502
	STUTERATIO	1216
	AMALM	31433
	AMALF	31687
	AM	24373
	ASALM	17784
	ASALF	18097
	AS	13828
	BLALM	11599
	BLALF	12288

BL		8706
HPALM		40038
HPALF		40567
HP		34906
HIALM		4686
HIALF		4907
HI		3698
TRALM		8943
TRALF		9128
TR		6706
WHALM		4354
WHALF		4607
WH		3784
LATCOD		6
LONCOD		6
dtype:	int64	

The above table shows us how many null values are there in each attribute.

Removing Null Values:

However the total number of rows in the tab 100722. We will remove the attributes having 90% of data as 'null'. Droping Lunch data as well as it is not usefull in this analysis.

In [8]:	<pre>attributes_to_remove = ['LSTREET2', 'TOTMENROL', 'TOTFENROL','TOTFRL','FRELCH','REL df = data.drop(attributes_to_remove, axis=1)</pre>														
In [9]:	df	head(5)													
Out[9]:		SURVYEAR	STABR	LEAID	ST_LEAID	LEA_NAME	SCH_NAME	LSTREET1	LCITY	LSTATE					
	0	2020-2021	AL	100005	AL-101	Albertville City	Albertville Middle School	600 E Alabama Ave	Albertville	AL					
	1 2020-20		AL	100005	AL-101	Albertville City	Albertville High School	402 E McCord Ave	Albertville	AL					
	2	2020-2021	AL	100005	AL-101	Albertville City	Albertville Intermediate School	901 W McKinney Ave	Albertville	AL					
	3 2020-20214 2020-2021				AL-101	Albertville City	Albertville Elementary School	145 West End Drive Albertv		AL					
					AL-101	AL-101 Albertville City		257 Country Club Rd	Albertville	AL					
										•					

Grade values can be zero. therefore, replacing NaN with 0. Moreover, there can be zero number of students from different race in some schools. so it can be zero as well.

```
In [10]: attributes_to_replace = ['KG','G01','G02','G03','G04','G05','G06','G07','G08','G09
    df[attributes_to_replace] = df[attributes_to_replace].fillna(0)
In [11]: df.head(3)
```

Out[11]:		SURVYEAR	STABR	LEAID	ST_LEAID	LEA_NAME	SCH_NAME	LSTREET1	LCITY	LSTATE
	0	2020-2021	AL	100005	AL-101	Albertville City	Albertville Middle School	600 E Alabama Ave	Albertville	AL
	1	2020-2021	AL	100005	AL-101	Albertville City	Albertville High School	402 E McCord Ave	Albertville	AL
	2	2020-2021	AL	100005	AL-101	Albertville City	Albertville Intermediate School	901 W McKinney Ave	Albertville	AL
4										•

The total number of students and members cannot be zero. So, removing rows that have NAN in their total and Member Attribute.

```
In [12]: df = df.dropna(subset=['TOTAL','MEMBER','FTE','STUTERATIO'])
In [13]: df.isnull().sum()
```

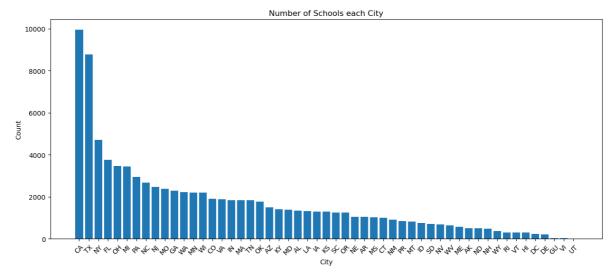
SURVYEAR 0 Out[13]: 0 STABR LEAID 0 ST_LEAID 0 0 LEA_NAME SCH_NAME 0 3 LSTREET1 0 **LCITY LSTATE** 0 LZIP 0 LZIP4 0 CHARTER_TEXT 0 MAGNET_TEXT 0 0 VIRTUAL **GSLO** 0 GSHI 0 SCHOOL_LEVEL 0 TITLEI 0 0 STITLEI **STATUS** 0 SCHOOL_TYPE_TEXT 0 SY_STATUS_TEXT 0 ULOCALE 0 NMCNTY 0 PΚ 0 0 KG 0 G01 G02 0 G03 0 G04 0 0 G05 G06 0 G07 0 0 G08 G09 0 G10 0 0 G11 G12 0 G13 0 UG 0 ΑE 0 0 TOTAL MEMBER 0 0 FTE 0 **STUTERATIO** AMALM 0 0 AMALF 0 AM 0 **ASALM ASALF** 0 AS 0 **BLALM** 0 0 **BLALF** 0 BL**HPALM** 0 **HPALF** 0 0 HP HIALM 0 0 HIALF 0 ΗI **TRALM** 0 TRALF 0 0 TR WHALM

WHALF 0
WH 0
LATCOD 0
LONCOD 0
dtype: int64

All NaN are removed.

Discriptive Visualization

```
import matplotlib.pyplot as plt
In [14]:
           df.head(4)
In [15]:
Out[15]:
              SURVYEAR STABR
                                  LEAID ST_LEAID
                                                    LEA_NAME
                                                                SCH_NAME
                                                                            LSTREET1
                                                                                           LCITY LSTATE
                                                                  Albertville
                                                                                 600 E
                                                     Albertville
              2020-2021
                                 100005
                                            AL-101
                                                                     Middle
                                                                              Alabama
                                                                                       Albertville
                                                                                                      ΑL
                             ΑL
                                                          City
                                                                     School
                                                                                  Ave
                                                                                 402 E
                                                     Albertville
                                                                  Albertville
              2020-2021
                             AL 100005
                                            AL-101
                                                                               McCord
                                                                                       Albertville
                                                                                                      ΑL
                                                          City
                                                                High School
                                                                                  Ave
                                                                  Albertville
                                                                                901 W
                                                     Albertville
              2020-2021
                             AL 100005
                                            AL-101
                                                                Intermediate
                                                                             McKinney
                                                                                       Albertville
                                                                                                      ΑL
                                                          City
                                                                     School
                                                                                  Ave
                                                                  Albertville
                                                     Albertville
                                                                              145 West
              2020-2021
                             AL 100005
                                            AL-101
                                                                                       Albertville
                                                                                                      ΑL
                                                                 Elementary
                                                          City
                                                                             End Drive
                                                                     School
           charter_counts = df['LSTATE'].value_counts()
In [16]:
           labels = charter_counts.index
           values = charter_counts.values
           plt.figure(figsize=(15, 6))
           plt.bar(labels, values)
           plt.title('Number of Schools each City')
           plt.xlabel('City')
           plt.ylabel('Count')
           plt.xticks(rotation=45)
           plt.show()
```



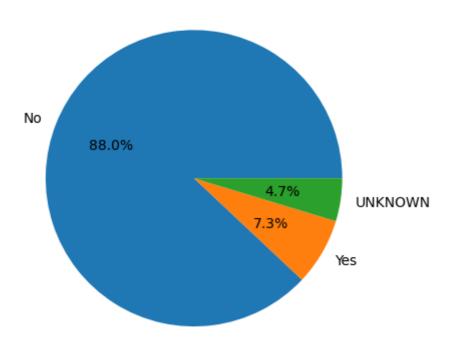
In [17]: filtered_df = df[df['CHARTER_TEXT'] == 'N']
filtered_df.head(10)

Out[17]:		SURVYEAR	STABR	LEAID	ST_LEAID	LEA_NAME	SCH_NAME	LSTREET1	LCITY	LSTA
	52271	2020-2021	MT	3000002	MT-0327	Somers Elem	Lakeside Elementary School	255 Adams Street	Lakeside	1
	52272	2020-2021	MT	3000002	MT-0327	Somers Elem	Somers Middle School	315 School Addition Rd	Somers	I
	52273	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	Glacier Elementary School	451 Tipville Road	Cut Bank	I
	52274	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	Anna Jeffries Elementary	105 2nd Street NW	Cut Bank	I
	52275	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	Cut Bank Middle School	101 3rd Avenue SE	Cut Bank	I
	52276	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	Hidden Lake Elementary	100 Welch Road	Cut Bank	I
	52277	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	Zenith Elementary	Zenith Colony Road	Cut Bank	I
	52278	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	H C Davis Elementary	15 2nd Avenue SE	Cut Bank	I
	52279	2020-2021	MT	3000003	MT-0402	Cut Bank Elem	Horizon Elementary	100 Horizon Road	Cut Bank	I
	52280	2020-2021	МТ	3000004	MT-1222	Mountain View Elem	Mountain View Elementary	Pardue Road- Seville	Cut Bank	I
4										

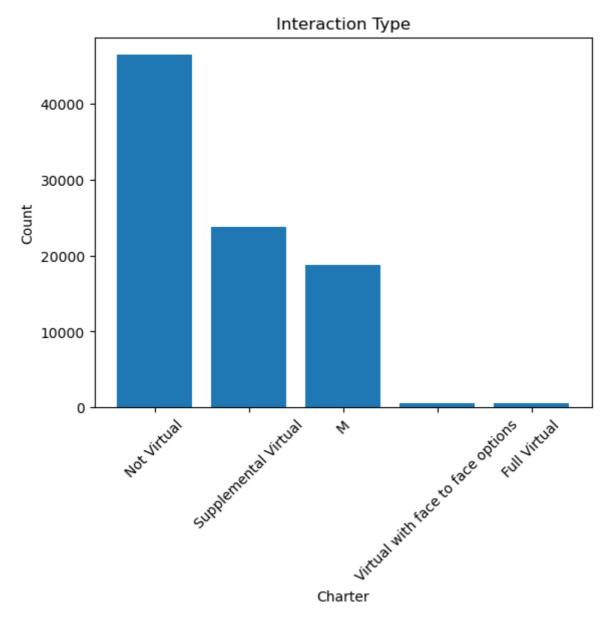
In [18]: df.head(4)

```
Out[18]:
             SURVYEAR STABR LEAID ST_LEAID LEA_NAME SCH_NAME LSTREET1
                                                                                         LCITY LSTATE
                                                                 Albertville
                                                                               600 E
                                                    Albertville
                             AL 100005
                                           AL-101
                                                                            Alabama
              2020-2021
                                                                    Middle
                                                                                     Albertville
                                                                                                    ΑL
                                                          City
                                                                    School
                                                                                 Ave
                                                                               402 E
                                                    Albertville
                                                                 Albertville
              2020-2021
                             AL 100005
                                           AL-101
                                                                             McCord Albertville
                                                                                                    ΑL
                                                               High School
                                                          City
                                                                                 Ave
                                                                              901 W
                                                                 Albertville
                                                    Albertville
              2020-2021
                             AL 100005
                                           AL-101
                                                               Intermediate
                                                                           McKinney
                                                                                     Albertville
                                                                                                    ΑL
                                                          City
                                                                    School
                                                                                 Ave
                                                                 Albertville
                                                    Albertville
                                                                            145 West
              2020-2021
                             AL 100005
                                           AL-101
                                                                                      Albertville
                                                                Elementary
                                                                                                    ΑL
                                                                            End Drive
                                                          City
                                                                    School
          df['CHARTER_TEXT'].unique()
In [19]:
          array(['No', 'Yes', 'N'], dtype=object)
Out[19]:
           df['CHARTER_TEXT'] = df['CHARTER_TEXT'].replace('N', 'UNKNOWN')
In [20]:
          df.loc[df['CHARTER_TEXT'] == 'N',]
In [21]:
            SURVYEAR STABR LEAID ST_LEAID LEA_NAME SCH_NAME LSTREET1 LCITY LSTATE LZIP
Out[21]:
                                                                                                     \blacktriangleright
           charter_counts = df['CHARTER_TEXT'].value_counts()
In [22]:
           labels = charter_counts.index
           sizes = charter_counts.values
           plt.pie(sizes, labels=labels, autopct='%1.1f%%')
           plt.title('Charter Type')
           plt.show()
```

Charter Type



```
In [23]: df['CHARTER_TEXT'].unique()
         array(['No', 'Yes', 'UNKNOWN'], dtype=object)
Out[23]:
         df['VIRTUAL'].unique()
In [24]:
         array(['Not Virtual', 'Full Virtual', 'Supplemental Virtual',
Out[24]:
                 'Virtual with face to face options', 'M'], dtype=object)
In [25]:
         charter_counts = df['VIRTUAL'].value_counts()
         labels = charter_counts.index
         values = charter_counts.values
         plt.bar(labels, values)
         plt.title('Interaction Type')
         plt.xlabel('Charter')
         plt.ylabel('Count')
         plt.xticks(rotation=45)
         plt.show()
```



```
In [26]: charter_counts = df['GSLO'].value_counts()

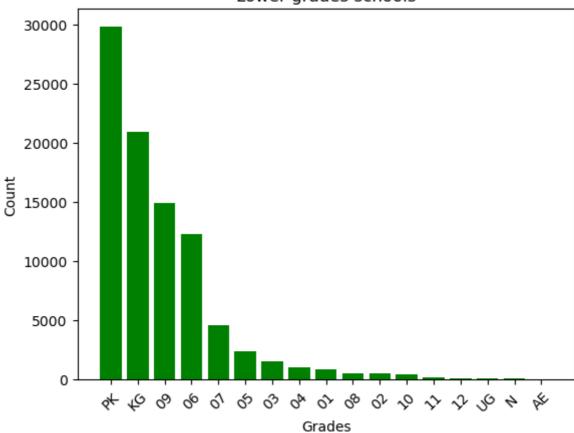
labels = charter_counts.index
values = charter_counts.values
bar_color = 'green'

plt.bar(labels, values, color=bar_color)

plt.title('Lower grades schools')
plt.xlabel('Grades')
plt.ylabel('Gount')
plt.xticks(rotation=45)

plt.show()
```

Lower grades schools



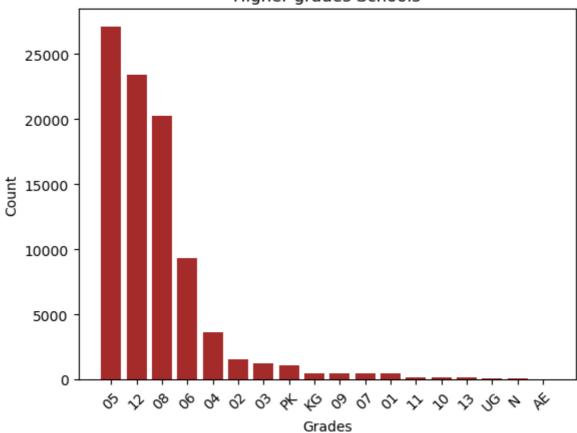
```
In [27]: charter_counts = df['GSHI'].value_counts()

labels = charter_counts.index
values = charter_counts.values
bar_color = 'brown'

plt.bar(labels, values, color=bar_color)

plt.title('Higher grades Schools')
plt.xlabel('Grades')
plt.ylabel('Gount')
plt.xticks(rotation=45)
```

Higher grades Schools

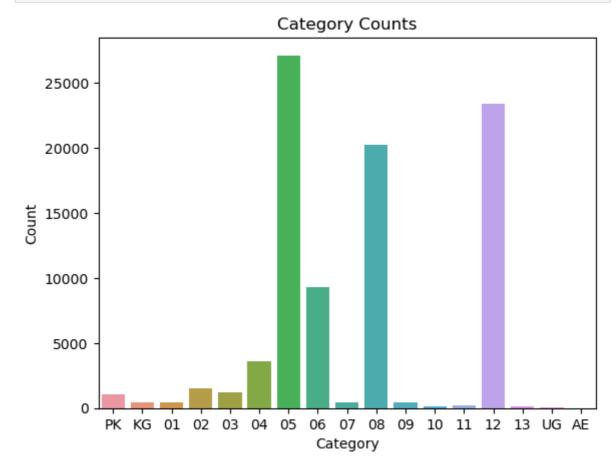


```
df.head(4)
In [28]:
Out[28]:
             SURVYEAR STABR
                                 LEAID ST LEAID LEA NAME
                                                               SCH NAME LSTREET1
                                                                                         LCITY LSTATE
                                                                 Albertville
                                                                               600 E
                                                     Albertville
              2020-2021
                             AL 100005
                                           AL-101
                                                                    Middle
                                                                             Alabama
                                                                                     Albertville
                                                                                                    ΑL
                                                          City
                                                                    School
                                                                                 Ave
                                                                               402 E
                                                     Albertville
                                                                 Albertville
              2020-2021
                             AL 100005
                                           AL-101
                                                                             McCord
                                                                                     Albertville
                                                                                                    ΑL
                                                          City
                                                               High School
                                                                                 Ave
                                                                 Albertville
                                                                               901 W
                                                     Albertville
              2020-2021
                             AL 100005
                                           AL-101
                                                               Intermediate
                                                                            McKinney
                                                                                      Albertville
                                                                                                    AL
                                                          City
                                                                    School
                                                                                 Ave
                                                                 Albertville
                                                     Albertville
                                                                            145 West
                                           AL-101
              2020-2021
                             AL 100005
                                                                Elementary
                                                                                      Albertville
                                                                                                    ΑL
                                                          City
                                                                            End Drive
                                                                    School
           import seaborn as sns
In [29]:
          df['GSHI'].unique()
In [30]:
          array(['08', '12', '06', '04', 'KG', '02', '05', '03', '01', '09', '10',
Out[30]:
                   '07', 'PK', '11', 'UG', 'N ', '13', 'AE'], dtype=object)
           custom_order = ['PK','KG','01','02','03','04','05','06','07','08','09','10','11','
In [31]:
           df['GSHI'] = pd.Categorical(df['GSHI'], categories=custom_order, ordered=True)
           sorted_df = df.sort_values('GSHI')
```

```
sns.countplot(data=sorted_df, x='GSHI')

plt.title('Category Counts')
plt.xlabel('Category')
plt.ylabel('Count')

plt.show()
```

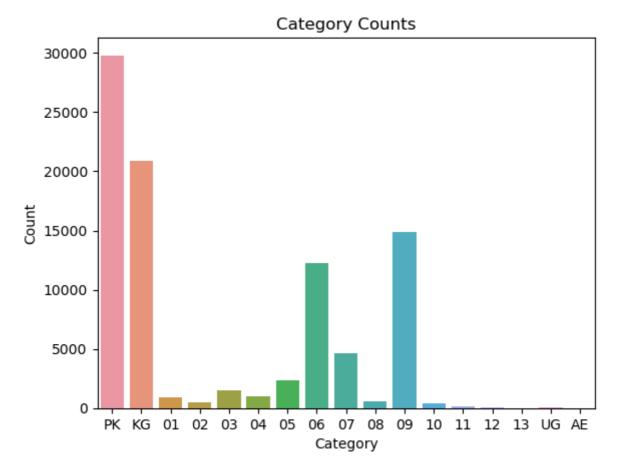


```
In [32]: df['GSLO'] = pd.Categorical(df['GSLO'], categories=custom_order, ordered=True)

sorted_df = df.sort_values('GSLO')

sns.countplot(data=sorted_df, x='GSLO')

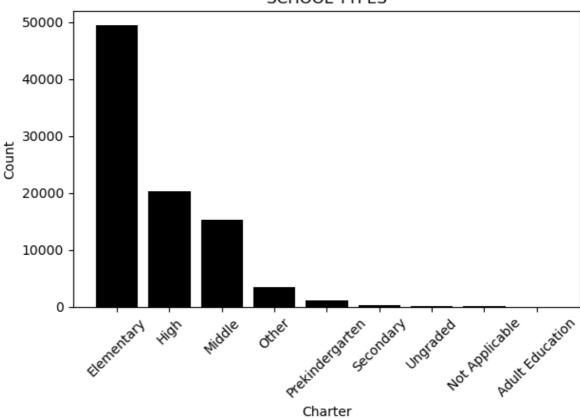
plt.title('Category Counts')
plt.xlabel('Category')
plt.ylabel('Count')
plt.show()
```



In [33]:	df	head(6)										
Out[33]:		SURVYEAR	STABR	LEAID	ST_LEAID	LEA_NAME	SCH_NAME	LSTREET1	LCITY	LSTATE		
	0	2020-2021	AL	100005	AL-101	Albertville City	Albertville Middle School	600 E Alabama Ave	Albertville	AL		
	1	2020-2021	AL	100005	AL-101	Albertville City	Albertville High School	402 E McCord Ave	Albertville	AL		
	2	2020-2021	AL	100005	AL-101	Albertville City	Albertville Intermediate School	901 W McKinney Ave	Albertville	AL		
	3	2020-2021	AL	100005	AL-101	Albertville City	Albertville Elementary School	145 West End Drive	Albertville	AL		
	4	2020-2021	AL	100005	AL-101	Albertville City	Albertville Kindergarten and PreK	257 Country Club Rd	Albertville	AL		
	5	2020-2021	AL	100005	AL-101	Albertville City	Albertville Primary School	1100 Horton Rd	Albertville	AL		
4										•		
In [34]:	: df['GSLO'].head(20)											

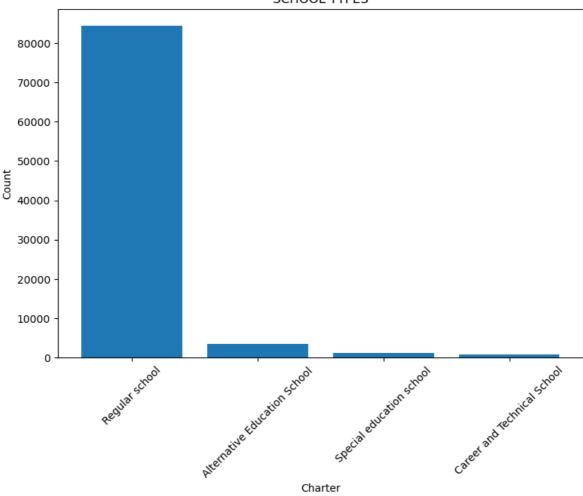
```
07
Out[34]:
        1
              09
        2
              05
        3
              03
        4
              PK
        5
              01
              05
        6
        7
              06
        9
              03
        10
              09
        11
              03
        12
              09
        13
              PK
              PK
        16
        17
              06
        18
              PK
        19
              06
        20
              PΚ
        21
              PK
        22
              PK
        Name: GSLO, dtype: category
        Categories (17, object): ['PK' < 'KG' < '01' < '02' ... '12' < '13' < 'UG' < 'AE']
        df['SCHOOL_LEVEL'].unique()
In [35]:
        Out[35]:
              dtype=object)
In [36]: charter_counts = df['SCHOOL_LEVEL'].value_counts()
         labels = charter_counts.index
         values = charter_counts.values
         bar_color='black'
         plt.bar(labels, values, color=bar_color)
         plt.title('SCHOOL TYPES')
         plt.xlabel('Charter')
         plt.ylabel('Count')
         plt.xticks(rotation=45)
         plt.tight_layout()
         plt.show()
```

SCHOOL TYPES



```
df['SCHOOL_TYPE_TEXT'].unique()
In [37]:
         array(['Regular school', 'Special education school',
Out[37]:
                 'Alternative Education School', 'Career and Technical School'],
               dtype=object)
In [38]:
         charter_counts = df['SCHOOL_TYPE_TEXT'].value_counts()
          labels = charter_counts.index
          values = charter_counts.values
          plt.figure(figsize=(9, 6))
          plt.bar(labels, values)
          plt.title('SCHOOL TYPES')
          plt.xlabel('Charter')
          plt.ylabel('Count')
          plt.xticks(rotation=45)
          plt.show()
```

SCHOOL TYPES



```
In [39]: attribute_columns = ['KG','G01','G02','G03','G04','G05','G06','G07','G08','G09','G
          sum_values = df[attribute_columns].sum()
          print(sum_values)
          KG
                 3189874.0
          G01
                 3326469.0
         G02
                 3332491.0
          G03
                 3353836.0
         G04
                 3404069.0
         G05
                 3440254.0
          G06
                 3533804.0
         G07
                 3640888.0
         G08
                 3667536.0
         G09
                 3793267.0
         G10
                 3675358.0
         G11
                 3481369.0
         G12
                 3420053.0
         G13
                    1943.0
         UG
                  122316.0
         ΑE
                    4595.0
         PΚ
                  990539.0
         dtype: float64
In [40]:
         df.head(2)
```

Out[40]:		SURVYEAR	STABR	LEAID	ST_LEAID	LEA_NAME	SCH_NAME	LSTREET1	LCITY	LSTATE				
	0	2020-2021	AL	100005	AL-101	Albertville City	Albertville Middle School	600 E Alabama Ave	Albertville	AL				
	1	2020-2021	AL	100005	AL-101	Albertville City	Albertville High School	402 E McCord Ave	Albertville	AL				
4										>				
In [41]:	со	rrelation_	matrix	= df.co	rr()									
In [42]:	со	<pre>correlation_matrix=correlation_matrix.round(2)</pre>												
In [43]:	СО	rrelation_	matrix											

Out[43]:

	LEAID	LZIP	STATUS	PK	KG	G01	G02	G03	G04	G05	G06	G07	GC
LEAID	1.00	-0.21	0.01	0.09	-0.06	-0.04	-0.04	-0.04	-0.05	-0.04	-0.02	-0.02	-0.0
LZIP	-0.21	1.00	0.00	-0.03	0.02	-0.01	-0.01	-0.01	-0.01	-0.01	-0.01	-0.01	-0.0
STATUS	0.01	0.00	1.00	-0.00	-0.01	-0.01	-0.02	-0.02	-0.01	-0.01	-0.00	-0.01	-0.0
PK	0.09	-0.03	-0.00	1.00	0.32	0.27	0.24	0.19	0.17	0.11	-0.13	-0.14	-0.1
KG	-0.06	0.02	-0.01	0.32	1.00	0.89	0.84	0.71	0.65	0.49	-0.15	-0.22	-0.2
G01	-0.04	-0.01	-0.01	0.27	0.89	1.00	0.93	0.78	0.70	0.53	-0.16	-0.24	-0.2
G02	-0.04	-0.01	-0.02	0.24	0.84	0.93	1.00	0.83	0.74	0.55	-0.16	-0.24	-0.2
G03	-0.04	-0.01	-0.02	0.19	0.71	0.78	0.83	1.00	0.89	0.67	-0.15	-0.23	-0.2
G04	-0.05	-0.01	-0.01	0.17	0.65	0.70	0.74	0.89	1.00	0.77	-0.11	-0.22	-0.2
G05	-0.04	-0.01	-0.01	0.11	0.49	0.53	0.55	0.67	0.77	1.00	0.08	-0.14	-0.1
G06	-0.02	-0.01	-0.00	-0.13	-0.15	-0.16	-0.16	-0.15	-0.11	0.08	1.00	0.75	0.7
G07	-0.02	-0.01	-0.01	-0.14	-0.22	-0.24	-0.24	-0.23	-0.22	-0.14	0.75	1.00	0.9
G08	-0.02	-0.01	-0.01	-0.14	-0.23	-0.24	-0.24	-0.23	-0.22	-0.15	0.73	0.97	1.(
G09	-0.02	-0.00	-0.01	-0.12	-0.22	-0.23	-0.24	-0.23	-0.23	-0.21	-0.12	-0.09	-0.0
G10	-0.02	-0.00	-0.02	-0.12	-0.22	-0.24	-0.24	-0.24	-0.23	-0.21	-0.13	-0.10	-0.1
G11	-0.02	-0.00	-0.02	-0.12	-0.23	-0.24	-0.24	-0.24	-0.23	-0.21	-0.13	-0.10	-0.1
G12	-0.03	0.00	-0.02	-0.12	-0.23	-0.24	-0.25	-0.24	-0.24	-0.22	-0.13	-0.11	-0.1
G13	0.01	-0.02	-0.00	-0.01	-0.02	-0.02	-0.02	-0.02	-0.02	-0.02	-0.01	-0.01	-0.0
UG	0.05	-0.15	-0.00	-0.00	-0.03	-0.03	-0.03	-0.03	-0.03	-0.02	-0.01	-0.01	-0.0
AE	0.00	0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.0
TOTAL	-0.06	-0.01	-0.03	-0.00	0.14	0.15	0.15	0.16	0.16	0.17	0.28	0.29	0.3
MEMBER	-0.06	-0.01	-0.03	-0.00	0.14	0.15	0.15	0.16	0.16	0.17	0.28	0.29	0.3
FTE	0.05	-0.17	-0.04	0.01	0.09	0.11	0.11	0.12	0.12	0.13	0.25	0.26	0.2
STUTERATIO	-0.02	0.03	0.01	0.00	0.01	0.01	0.01	0.01	0.01	0.01	0.01	0.01	0.0
AMALM	0.02	0.11	-0.01	0.03	0.01	0.01	0.01	0.01	0.01	0.01	0.01	0.02	0.0
AMALF	0.01	0.10	-0.01	0.03	0.01	0.01	0.01	0.01	0.01	0.01	0.02	0.02	0.0
AM	0.02	0.11	-0.01	0.03	0.01	0.01	0.01	0.01	0.01	0.01	0.02	0.02	0.0
ASALM	-0.07	0.04	-0.01	-0.04	0.06	0.07	0.07	0.08	0.08	0.08	0.11	0.12	0.1
ASALF	-0.07	0.04	-0.01	-0.04	0.06	0.07	0.07	0.08	0.08	0.08	0.11	0.12	0.1
AS	-0.07	0.04	-0.01	-0.04	0.06	0.07	0.07	0.08	0.08	0.08	0.11	0.12	0.1
BLALM	-0.03	-0.19	-0.01	0.04	0.07	0.08	0.08	0.08	0.08	0.08	0.15	0.15	0.1
BLALF	-0.03	-0.18	-0.01	0.03	0.07	0.08	0.08	0.08	0.08	0.08	0.15	0.15	0.1
BL	-0.03	-0.18	-0.01	0.04	0.07	0.08	0.08	0.08	0.08	0.08	0.15	0.15	0.1
HPALM	-0.01	0.10	-0.01	-0.01	0.00	0.01	0.01	0.01	0.01	0.01	0.02	0.03	0.0
HPALF	-0.01	0.10	-0.01	-0.01	0.00	0.01	0.01	0.01	0.01	0.01	0.03	0.03	0.0
HP	-0.01	0.10	-0.01	-0.01	0.00	0.01	0.01	0.01	0.01	0.01	0.02	0.03	0.0

```
LEAID LZIP STATUS
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           from sklearn.model_selection import train_test_split
           X = df.drop('TOTAL', axis=1)
In [47]:
           y = df['TOTAL']
In [48]:
           X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_st
In [49]:
           print("Training Features Shape:", X_train.shape)
           print("Testing Features Shape:", X_test.shape)
           print("Training Labels Shape:", y_train.shape)
           print("Testing Labels Shape:", y_test.shape)
           Training Features Shape: (71972, 67)
           Testing Features Shape: (17993, 67)
           Training Labels Shape: (71972,)
           Testing Labels Shape: (17993,)
```

In []: