

```
In [1]: import pandas as pd
import numpy as np
```

Data Frame Operations

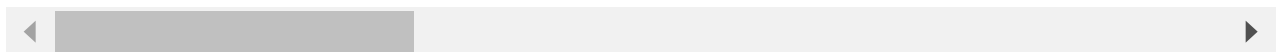
(1) Working With Operators On a Series

```
In [2]: movie = pd.read_csv('movie.csv')
movie
```

```
Out[2]:
```

| | color | director_name | num_critic_for_reviews | duration | director_facebook_likes | actor_3_facebook_likes |
|------|-------|-------------------|------------------------|----------|-------------------------|------------------------|
| 0 | Color | James Cameron | 723.0 | 178.0 | 0.0 | 85 |
| 1 | Color | Gore Verbinski | 302.0 | 169.0 | 563.0 | 100 |
| 2 | Color | Sam Mendes | 602.0 | 148.0 | 0.0 | 16 |
| 3 | Color | Christopher Nolan | 813.0 | 164.0 | 22000.0 | 2300 |
| 4 | NaN | Doug Walker | NaN | NaN | 131.0 | N |
| ... | ... | ... | ... | ... | ... | ... |
| 4911 | Color | Scott Smith | 1.0 | 87.0 | 2.0 | 31 |
| 4912 | Color | NaN | 43.0 | 43.0 | NaN | 31 |
| 4913 | Color | Benjamin Roberds | 13.0 | 76.0 | 0.0 | ... |
| 4914 | Color | Daniel Hsia | 14.0 | 100.0 | 0.0 | 48 |
| 4915 | Color | Jon Gunn | 43.0 | 90.0 | 16.0 | 1 |

4916 rows × 28 columns



```
In [3]: imdb_score = movie['imdb_score']
imdb_score
```

```
Out[3]:
```

| | |
|------|-----|
| 0 | 7.9 |
| 1 | 7.1 |
| 2 | 6.8 |
| 3 | 8.5 |
| 4 | 7.1 |
| ... | ... |
| 4911 | 7.7 |

```
4912    7.5
4913    6.3
4914    6.3
4915    6.6
Name: imdb_score, Length: 4916, dtype: float64
```

```
In [4]: imdb_score * 2.5
```

```
Out[4]: 0      19.75
        1      17.75
        2      17.00
        3      21.25
        4      17.75
        ...
4911    19.25
4912    18.75
4913    15.75
4914    15.75
4915    16.50
Name: imdb_score, Length: 4916, dtype: float64
```

```
In [5]: imdb_score // 7
```

```
Out[5]: 0      1.0
        1      1.0
        2      0.0
        3      1.0
        4      1.0
        ...
4911    1.0
4912    1.0
4913    0.0
4914    0.0
4915    0.0
Name: imdb_score, Length: 4916, dtype: float64
```

```
In [6]: imdb_score > 7
```

```
Out[6]: 0      True
        1      True
        2     False
        3      True
        4      True
        ...
4911    True
4912    True
4913    False
4914    False
4915    False
Name: imdb_score, Length: 4916, dtype: bool
```

```
In [7]: imdb_score
```

```
Out[7]: 0      7.9
        1      7.1
        2      6.8
        3      8.5
        4      7.1
        ...
4911    7.7
```

```

4912    7.5
4913    6.3
4914    6.3
4915    6.6
Name: imdb_score, Length: 4916, dtype: float64

```

(2) Working With Operators On a Data Frame

```

In [8]: college = pd.read_csv('college.csv')
college

```

```

Out[8]:

```

| | INSTNM | CITY | STABBR | HBCU | MENONLY | WOMENONLY | RELAFFIL | SATVRMID | SATM |
|------|---|---------------------|--------|------|---------|-----------|----------|----------|------|
| 0 | Alabama A & M University | Normal | AL | 1.0 | 0.0 | 0.0 | 0 | 424.0 | |
| 1 | University of Alabama at Birmingham | Birmingham | AL | 0.0 | 0.0 | 0.0 | 0 | 570.0 | |
| 2 | Amridge University | Montgomery | AL | 0.0 | 0.0 | 0.0 | 1 | NaN | |
| 3 | University of Alabama in Huntsville | Huntsville | AL | 0.0 | 0.0 | 0.0 | 0 | 595.0 | |
| 4 | Alabama State University | Montgomery | AL | 1.0 | 0.0 | 0.0 | 0 | 425.0 | |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 7530 | SAE Institute of Technology San Francisco | Emeryville | CA | NaN | NaN | NaN | 1 | NaN | |
| 7531 | Rasmussen College - Overland Park | Overland Park | KS | NaN | NaN | NaN | 1 | NaN | |
| 7532 | National Personal Training Institute of Cleveland | Highland Heights | OH | NaN | NaN | NaN | 1 | NaN | |
| 7533 | Bay Area Medical Academy - San Jose Satellite ... | San Jose | CA | NaN | NaN | NaN | 1 | NaN | |
| 7534 | Excel Learning | San Antonio | TX | NaN | NaN | NaN | 1 | NaN | |

| INSTNM | CITY | STABBR | HBCU | MENONLY | WOMENONLY | RELAFFIL | SATVRMID | SATM |
|--------------------------------|------|--------|------|---------|-----------|----------|----------|------|
| Center-San Antonio South | | | | | | | | |

7535 rows × 27 columns

In [9]:

```
college.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7535 entries, 0 to 7534
Data columns (total 27 columns):
#   Column                Non-Null Count  Dtype
---  -
0   INSTNM                7535 non-null   object
1   CITY                  7535 non-null   object
2   STABBR                7535 non-null   object
3   HBCU                  7164 non-null   float64
4   MENONLY               7164 non-null   float64
5   WOMENONLY             7164 non-null   float64
6   RELAFFIL              7535 non-null   int64
7   SATVRMID              1185 non-null   float64
8   SATMTMID              1196 non-null   float64
9   DISTANCEONLY          7164 non-null   float64
10  UGDS                   6874 non-null   float64
11  UGDS_WHITE            6874 non-null   float64
12  UGDS_BLACK            6874 non-null   float64
13  UGDS_HISP             6874 non-null   float64
14  UGDS_ASIAN            6874 non-null   float64
15  UGDS_AIAN             6874 non-null   float64
16  UGDS_NHPI             6874 non-null   float64
17  UGDS_2MOR             6874 non-null   float64
18  UGDS_NRA              6874 non-null   float64
19  UGDS_UNKN             6874 non-null   float64
20  PPTUG_EF              6853 non-null   float64
21  CURROPER              7535 non-null   int64
22  PCTPELL               6849 non-null   float64
23  PCTFLOAN              6849 non-null   float64
24  UG25ABV               6718 non-null   float64
25  MD_EARN_WNE_P10       6413 non-null   object
26  GRAD_DEBT_MDN_SUPP    7503 non-null   object
dtypes: float64(20), int64(2), object(5)
memory usage: 1.6+ MB
```

In [10]:

```
college.columns
```

Out[10]:

```
Index(['INSTNM', 'CITY', 'STABBR', 'HBCU', 'MENONLY', 'WOMENONLY', 'RELAFFIL',
      'SATVRMID', 'SATMTMID', 'DISTANCEONLY', 'UGDS', 'UGDS_WHITE',
      'UGDS_BLACK', 'UGDS_HISP', 'UGDS_ASIAN', 'UGDS_AIAN', 'UGDS_NHPI',
      'UGDS_2MOR', 'UGDS_NRA', 'UGDS_UNKN', 'PPTUG_EF', 'CURROPER', 'PCTPELL',
      'PCTFLOAN', 'UG25ABV', 'MD_EARN_WNE_P10', 'GRAD_DEBT_MDN_SUPP'],
      dtype='object')
```

In [11]:

```
college = pd.read_csv('college.csv', index_col = 'INSTNM')
college_ugds_ = college.filter(like = 'UGDS_')
college_ugds_
```

Out[11]:

| | UGDS_WHITE | UGDS_BLACK | UGDS_HISP | UGDS_ASIAN | UGDS_AIAN | UGDS_NHPI | UGDS_2M |
|--|------------|------------|-----------|------------|-----------|-----------|---------|
| INSTNM | | | | | | | |
| Alabama A & M University | 0.0333 | 0.9353 | 0.0055 | 0.0019 | 0.0024 | 0.0019 | 0.0 |
| University of Alabama at Birmingham | 0.5922 | 0.2600 | 0.0283 | 0.0518 | 0.0022 | 0.0007 | 0.0 |
| Amridge University | 0.2990 | 0.4192 | 0.0069 | 0.0034 | 0.0000 | 0.0000 | 0.0 |
| University of Alabama in Huntsville | 0.6988 | 0.1255 | 0.0382 | 0.0376 | 0.0143 | 0.0002 | 0.0 |
| Alabama State University | 0.0158 | 0.9208 | 0.0121 | 0.0019 | 0.0010 | 0.0006 | 0.0 |
| ... | ... | ... | ... | ... | ... | ... | ... |
| SAE Institute of Technology San Francisco | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| Rasmussen College - Overland Park | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| National Personal Training Institute of Cleveland | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| Bay Area Medical Academy - San Jose Satellite Location | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| Excel Learning Center-San Antonio South | NaN | NaN | NaN | NaN | NaN | NaN | NaN |

7535 rows × 9 columns



In [12]:

```
college_ugds_round_per = college_ugds_.round(2) * 100  
college_ugds_round_per
```

Out[12]:

| | UGDS_WHITE | UGDS_BLACK | UGDS_HISP | UGDS_ASIAN | UGDS_AIAN | UGDS_NHPI | UGDS_2I |
|--|------------|------------|-----------|------------|-----------|-----------|---------|
| INSTNM | | | | | | | |
| Alabama A & M University | 3.0 | 94.0 | 1.0 | 0.0 | 0.0 | 0.0 | |
| University of Alabama at Birmingham | 59.0 | 26.0 | 3.0 | 5.0 | 0.0 | 0.0 | |
| Amridge University | 30.0 | 42.0 | 1.0 | 0.0 | 0.0 | 0.0 | |
| University of Alabama in Huntsville | 70.0 | 13.0 | 4.0 | 4.0 | 1.0 | 0.0 | |
| Alabama State University | 2.0 | 92.0 | 1.0 | 0.0 | 0.0 | 0.0 | |
| ... | ... | ... | ... | ... | ... | ... | |
| SAE Institute of Technology San Francisco | NaN | NaN | NaN | NaN | NaN | NaN | |
| Rasmussen College - Overland Park | NaN | NaN | NaN | NaN | NaN | NaN | |
| National Personal Training Institute of Cleveland | NaN | NaN | NaN | NaN | NaN | NaN | |
| Bay Area Medical Academy - San Jose Satellite Location | NaN | NaN | NaN | NaN | NaN | NaN | |
| Excel Learning Center-San Antonio South | NaN | NaN | NaN | NaN | NaN | NaN | |

7535 rows × 9 columns

```
In [ ]: college_ugds_round_per.sort_values('UGDS_ASIAN', ascending = False)
```

(3) Count a Number of Values Using value_counts()

```
In [13]: movie = pd.read_csv('movie.csv')
```

```
In [14]: director = movie['director_name']  
actor_1_fb_likes = movie['actor_1_facebook_likes']
```

```
In [15]: director
```

```
Out[15]: 0          James Cameron  
1          Gore Verbinski  
2           Sam Mendes  
3    Christopher Nolan  
4          Doug Walker  
        ...  
4911         Scott Smith  
4912                NaN  
4913    Benjamin Roberds  
4914         Daniel Hsia  
4915           Jon Gunn  
Name: director_name, Length: 4916, dtype: object
```

```
In [16]: director.value_counts()
```

```
Out[16]: Steven Spielberg    26  
Woody Allen                22  
Martin Scorsese            20  
Clint Eastwood             20  
Spike Lee                  16  
        ..  
Thea Sharrock              1  
Gary Chapman               1  
Fred Savage                1  
Robert M. Young            1  
Paul Abascal               1  
Name: director_name, Length: 2397, dtype: int64
```

```
In [17]: director.value_counts(normalize = True)
```

```
Out[17]: Steven Spielberg    0.005401  
Woody Allen                0.004570  
Martin Scorsese            0.004155  
Clint Eastwood             0.004155  
Spike Lee                  0.003324  
        ...  
Thea Sharrock              0.000208
```

```
Gary Chapman      0.000208
Fred Savage       0.000208
Robert M. Young   0.000208
Paul Abascal      0.000208
Name: director_name, Length: 2397, dtype: float64
```

```
In [18]: actor_1_fb_likes
```

```
Out[18]: 0      1000.0
         1     40000.0
         2     11000.0
         3     27000.0
         4       131.0
         ...
        4911      637.0
        4912      841.0
        4913        0.0
        4914      946.0
        4915       86.0
Name: actor_1_facebook_likes, Length: 4916, dtype: float64
```

```
In [19]: actor_1_fb_likes.value_counts()
```

```
Out[19]: 1000.0      436
         11000.0     206
         2000.0     189
         3000.0     150
        12000.0     131
         ...
         564.0        1
        46000.0        1
         49.0         1
         447.0         1
         161.0         1
Name: actor_1_facebook_likes, Length: 877, dtype: int64
```

(4) Descriptive Statistics

```
In [20]: movie = pd.read_csv('movie.csv')
         director = movie['director_name']
```

```
In [21]: director.describe()
```

```
Out[21]: count      4814
         unique      2397
         top      Steven Spielberg
         freq         26
         Name: director_name, dtype: object
```

```
In [22]: actor_1_fb_likes.describe()
```

```
Out[22]: count      4909.000000
         mean      6494.488491
         std      15106.986884
         min         0.000000
         25%       607.000000
```



```
50%          982.000000
75%         11000.000000
max         640000.000000
Name: actor_1_facebook_likes, dtype: float64
```

```
In [23]: actor_1_fb_likes.min()
```

```
Out[23]: 0.0
```

```
In [24]: actor_1_fb_likes.max()
```

```
Out[24]: 640000.0
```

```
In [25]: actor_1_fb_likes.mean()
```

```
Out[25]: 6494.488490527602
```

```
In [26]: actor_1_fb_likes.std()
```

```
Out[26]: 15106.986883848309
```

```
In [27]: actor_1_fb_likes.median()
```

```
Out[27]: 982.0
```

```
In [28]: actor_1_fb_likes.sum()
```

```
Out[28]: 31881444.0
```

```
In [29]: actor_1_fb_likes.quantile()
```

```
Out[29]: 982.0
```

```
In [30]: actor_1_fb_likes.quantile(0.5)
```

```
Out[30]: 982.0
```

```
In [31]: actor_1_fb_likes.quantile(0.2)
```

```
Out[31]: 510.0
```

```
In [32]: actor_1_fb_likes.quantile([0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9])
```

```
Out[32]: 0.1      240.0
         0.2      510.0
         0.3      694.0
         0.4      854.0
```

```

0.5      982.0
0.6     1000.0
0.7     8000.0
0.8    13000.0
0.9    18000.0
Name: actor_1_facebook_likes, dtype: float64

```

```
In [34]: movie.describe()
```

```
Out[34]:
```

| | num_critic_for_reviews | duration | director_facebook_likes | actor_3_facebook_likes | actor_1_facebook_likes |
|--------------|------------------------|-------------|-------------------------|------------------------|------------------------|
| count | 4867.000000 | 4901.000000 | 4814.000000 | 4893.000000 | 4901.000000 |
| mean | 137.988905 | 107.090798 | 691.014541 | 631.276313 | 6496.811180 |
| std | 120.239379 | 25.286015 | 2832.954125 | 1625.874802 | 15100.570074 |
| min | 1.000000 | 7.000000 | 0.000000 | 0.000000 | 0.000000 |
| 25% | 49.000000 | 93.000000 | 7.000000 | 132.000000 | 60.000000 |
| 50% | 108.000000 | 103.000000 | 48.000000 | 366.000000 | 98.000000 |
| 75% | 191.000000 | 118.000000 | 189.750000 | 633.000000 | 1100.000000 |
| max | 813.000000 | 511.000000 | 23000.000000 | 23000.000000 | 64000.000000 |

```
In [35]: movie.min()
```

```
Out[35]: num_critic_for_reviews      1.0
duration                          7.0
director_facebook_likes           0.0
actor_3_facebook_likes            0.0
actor_1_facebook_likes            0.0
gross                           162.0
genres                          Action
movie_title                      #Horror
num_voted_users                   5
cast_total_facebook_likes         0
facenumber_in_poster              0.0
movie_imdb_link                  http://www.imdb.com/title/tt0006864/?ref_=fn_t...
num_user_for_reviews              1.0
budget                           218.0
title_year                       1916.0
actor_2_facebook_likes            0.0
imdb_score                        1.6
aspect_ratio                      1.18
movie_facebook_likes              0
dtype: object

```

(5) Handling Null Values

```
In [36]: movie = pd.read_csv('movie.csv')
director = movie['director_name']
```

```
In [37]: director
```

```
Out[37]: 0      James Cameron
         1      Gore Verbinski
         2      Sam Mendes
         3      Christopher Nolan
         4      Doug Walker
         ...
        4911     Scott Smith
        4912           NaN
        4913     Benjamin Roberds
        4914     Daniel Hsia
        4915           Jon Gunn
        Name: director_name, Length: 4916, dtype: object
```

```
In [38]: director.hasnans
```

```
Out[38]: True
```

```
In [39]: director.isnull()
         # director.notnull()
```

```
Out[39]: 0      False
         1      False
         2      False
         3      False
         4      False
         ...
        4911     False
        4912      True
        4913     False
        4914     False
        4915     False
        Name: director_name, Length: 4916, dtype: bool
```

```
In [40]: director.isnull().any()
```

```
Out[40]: True
```

```
In [41]: director.isnull().sum()
```

```
Out[41]: 102
```

```
In [42]: actor_1_fb_likes.isnull()
```

```
Out[42]: 0      False
         1      False
         2      False
         3      False
         4      False
         ...
        4911     False
        4912     False
        4913     False
        4914     False
        4915     False
        Name: actor_1_facebook_likes, Length: 4916, dtype: bool
```

```
In [43]: actor_1_fb_likes.isnull().sum()
```

```
Out[43]: 7
```

```
In [44]: actor_1_fb_likes_filled = actor_1_fb_likes.fillna(0)
len(actor_1_fb_likes_filled)
# actor_1_fb_likes_filled.size
# actor_1_fb_likes_filled.count()
```

```
Out[44]: 4916
```

```
In [45]: actor_1_fb_likes_dropped = actor_1_fb_likes.dropna()
len(actor_1_fb_likes_dropped)
# actor_1_fb_likes_dropped.size
# actor_1_fb_likes_dropped.count()
```

```
Out[45]: 4909
```

(6) Transposing the Direction of a Data Frame Operation

```
In [46]: college = pd.read_csv('college.csv', index_col = 'INSTNM')
college_ugds_ = college.filter(like = 'UGDS_')
college_ugds_
```

```
Out[46]:
```

| | UGDS_WHITE | UGDS_BLACK | UGDS_HISP | UGDS_ASIAN | UGDS_AIAN | UGDS_NHPI | UGDS_2I |
|-------------------------------------|------------|------------|-----------|------------|-----------|-----------|---------|
| INSTNM | | | | | | | |
| Alabama A & M University | 0.0333 | 0.9353 | 0.0055 | 0.0019 | 0.0024 | 0.0019 | 0.0 |
| University of Alabama at Birmingham | 0.5922 | 0.2600 | 0.0283 | 0.0518 | 0.0022 | 0.0007 | 0.0 |
| Amridge University | 0.2990 | 0.4192 | 0.0069 | 0.0034 | 0.0000 | 0.0000 | 0.0 |
| University of Alabama in Huntsville | 0.6988 | 0.1255 | 0.0382 | 0.0376 | 0.0143 | 0.0002 | 0.0 |
| Alabama State University | 0.0158 | 0.9208 | 0.0121 | 0.0019 | 0.0010 | 0.0006 | 0.0 |
| ... | ... | ... | ... | ... | ... | ... | ... |
| SAE Institute of | NaN | NaN | NaN | NaN | NaN | NaN | NaN |

| | UGDS_WHITE | UGDS_BLACK | UGDS_HISP | UGDS_ASIAN | UGDS_AIAN | UGDS_NHPI | UGDS_2MOR | UGDS_NRA | UGDS_UNKN |
|---|------------|------------|-----------|------------|-----------|-----------|-----------|----------|-----------|
| INSTNM | | | | | | | | | |
| Technology San Francisco | | | | | | | | | |
| Rasmussen College - Overland Park | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| National Personal Training Institute of Cleveland | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| Bay Area Medical Academy - San Jose Satellite Location | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| Excel Learning Center-San Antonio South | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |

7535 rows × 9 columns

```
In [47]: college_ugds_.count()
```

```
Out[47]: UGDS_WHITE    6874
UGDS_BLACK    6874
UGDS_HISP     6874
UGDS_ASIAN    6874
UGDS_AIAN     6874
UGDS_NHPI     6874
UGDS_2MOR     6874
UGDS_NRA      6874
UGDS_UNKN     6874
dtype: int64
```

```
In [48]: college_ugds_.count(axis = 'index')
```

```
Out[48]: UGDS_WHITE    6874
UGDS_BLACK    6874
UGDS_HISP     6874
UGDS_ASIAN    6874
UGDS_AIAN     6874
UGDS_NHPI     6874
UGDS_2MOR     6874
UGDS_NRA      6874
UGDS_UNKN     6874
dtype: int64
```

```
In [49]: college_ugds_.count(axis = 'columns')
```

```
Out[49]: INSTNM
Alabama A & M University          9
University of Alabama at Birmingham 9
Amridge University                9
University of Alabama in Huntsville 9
Alabama State University          9
..
SAE Institute of Technology San Francisco 0
Rasmussen College - Overland Park    0
National Personal Training Institute of Cleveland 0
Bay Area Medical Academy - San Jose Satellite Location 0
Excel Learning Center-San Antonio South 0
Length: 7535, dtype: int64
```

```
In [50]: college_ugds_.count(axis = 'columns').sort_values()
```

```
Out[50]: INSTNM
Excel Learning Center-San Antonio South    0
Albany Law School                         0
Albany Medical College                     0
Institute for the Psychological Sciences    0
Forest Institute of Professional Psychology 0
..
Farmingdale State College                 9
SUNY College of Agriculture and Technology at Cobleskill 9
SUNY College of Technology at Delhi        9
SUNY College of Technology at Alfred       9
The University of Texas at Austin          9
Length: 7535, dtype: int64
```

```
In [51]: college_ugds_ = college_ugds_.dropna(how = 'all')
```

```
In [52]: college_ugds_.count(axis = 'columns').sort_values()
```

```
Out[52]: INSTNM
Alabama A & M University          9
Pike County Joint Vocational School District 9
South Texas College              9
Professional Technical Institution Inc    9
Franklin Technology-MSSU           9
..
CUNY Graduate School and University Center 9
CUNY City College                  9
College of Staten Island CUNY        9
CUNY Bronx Community College         9
Coastal Pines Technical College       9
Length: 6874, dtype: int64
```

```
In [53]: college_ugds_.count()
```

```
Out[53]: UGDS_WHITE    6874
UGDS_BLACK    6874
UGDS_HISP     6874
UGDS_ASIAN    6874
UGDS_AIAN     6874
```

| | |
|-----------|------|
| UGDS_NHPI | 6874 |
| UGDS_2MOR | 6874 |
| UGDS_NRA | 6874 |
| UGDS_UNKN | 6874 |

dtype: int64