

This sample is broken up into two sections, which reflect the two means through which I learned to code Python.

The first section reflects self-study via Harvard's online CS50 lectures for Python and their corresponding exercises. The second sections reflects some of my data visualization work at CSU Northridge.

A link with the instructions for each CS50 exercise is included just above my solutions. As far as I'm aware, there are no solutions to these exercises posted online by Harvard. The solutions provided below are uniquely my own and can be cross-checked with community solutions posted online to validate their uniqueness.

Section 1: CS50

```
#####  
#####  
# https://cs50.harvard.edu/python/2022/psets/2/plates/  
# Vanity Plates  
  
def main():  
    plate = input("Plate: ")  
    if is_valid(plate):  
        print("Valid")  
    else:  
        print("Invalid")  
  
#-----  
  
def is_valid(s):  
    if 2 <= len(s) <= 6 and s[0].isalpha() and s[1].isalpha():  
  
        # Flag variable  
        has_numeric = False  
  
        # Digits cannot appear in the middle of a license plate  
        for i in range(2, len(s)):  
            if s[i].isdigit():  
                has_numeric = True  
            elif s[i].isalpha() and has_numeric:  
                return False  
  
        # The first digit cannot be zero  
        if i >= 2 and s[i] == '0' and s[i-1].isalpha():  
            return False  
        else:  
            pass  
  
        # No periods, spaces, punctuation marks, or special  
characters  
        if s[i] in ['.', ' ', ',', ';', ':', '?', '!', '-', '_'],
```

```

'+', '=', '@', '#', '$', '%', '^', '&', '*', '(', ')']]:
    return False

    return True

else:
    return False

#-----

main()

#####
# https://cs50.harvard.edu/python/2022/psets/2/camel/
# camelCase

camelCase = input('Enter camelCase variable name: ')
snake_case = ''

for char in camelCase:
    if char.isupper():
        char = char.lower()
        snake_case += '_'
        snake_case += str(char)
    else:
        snake_case += str(char)

print(snake_case)

#####
# https://cs50.harvard.edu/python/2022/psets/2/coke/
# Coke Machine

left_owed = 50
print('One can of Coca-Cola is $0.50')

#-----
while True:
    if left_owed > 0:
        coin_value = int(input('Insert coin: '))

        if coin_value == 25 or coin_value == 10 or coin_value == 5:
            left_owed = left_owed - coin_value
            print(f'{left_owed} cents left')
        else:

```

```

        print('Invalid coin. Only 25, 10, and 5 cent coins are
accepted.')
        continue

    else:
        break
#-----

if left_owed < 0:
    print(f' Change is {left_owed - (2*left_owed)} cents. Enjoy your
Coke!')
else:
    print('Enjoy your Coke!')

#####
#####
# https://cs50.harvard.edu/python/2022/psets/2/twttr/
# Just setting up my twttr

vowel_string = input('Give a string: ')
no_vowels = ''

for char in vowel_string:
    match str(char):
        case 'A'|'E'|'I'|'O'|'U'|'a'|'e'|'i'|'o'|'u':
            no_vowels += ''
        case _:
            no_vowels += str(char)

print(no_vowels)

#####
#####
# https://cs50.harvard.edu/python/2022/psets/3/fuel/
# Fuel Gauge

def main():

    X, Y = input_filter()

    if X/Y >= 0.99:
        print('F')
    elif X/Y <= 0.01:
        print('E')
    else:
        print(str(round(X/Y*100)) + '%')

#-----

def input_filter():
    while True:

```

```

try:
    fraction_input = input('Enter fuel gauge in the form X/Y: ')
    X, Y = map(int, fraction_input.split('/'))
    return X, Y

except (ValueError, ZeroDivisionError):
    print('Please follow the formatting guidelines.')

else:
    return X, Y

#-----

main()

#%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
#%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
#%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
#%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
#%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

```

Section 2: Data Visualization

```

import matplotlib.pyplot as plt
from matplotlib_venn import venn2

import seaborn as sns
import pandas as pd
import numpy as np

from sklearn import linear_model
from sklearn.metrics import mean_squared_error, r2_score
from sklearn.model_selection import train_test_split

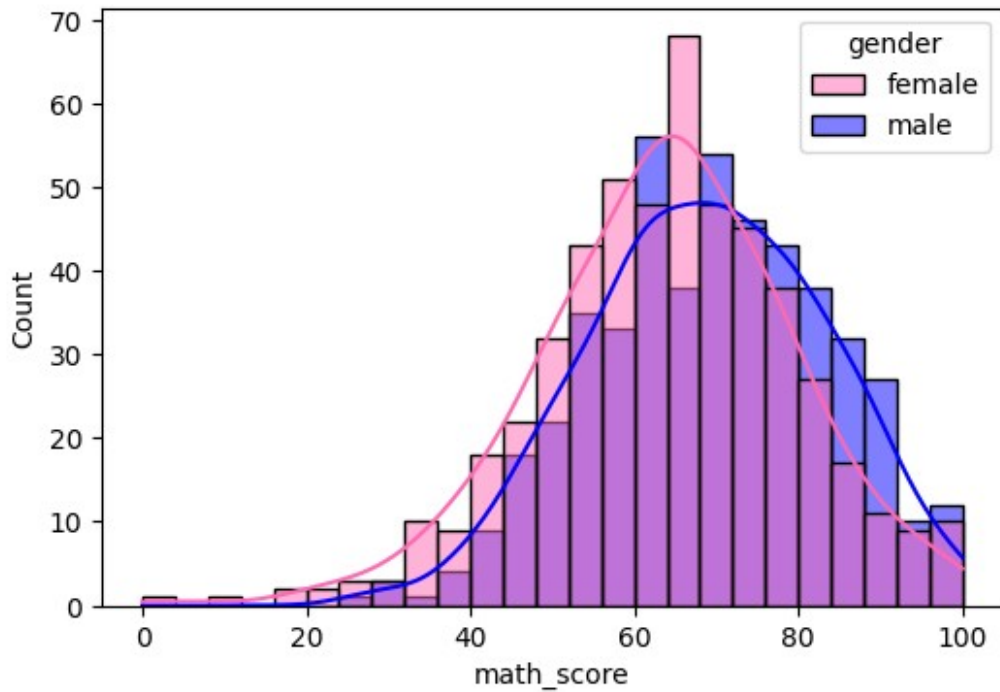
df = pd.read_csv('student.csv')
df.head(3)

```

	gender	ethnicity	parental_education	lunch
test_preparation_course \				
0	female	group B	bachelor's degree	standard
1	female	group C	some college	standard
2	female	group B	master's degree	standard
3	female	group B	master's degree	standard
4	female	group B	master's degree	standard
5	female	group B	master's degree	standard
6	female	group B	master's degree	standard
7	female	group B	master's degree	standard
8	female	group B	master's degree	standard
9	female	group B	master's degree	standard
10	female	group B	master's degree	standard
11	female	group B	master's degree	standard
12	female	group B	master's degree	standard
13	female	group B	master's degree	standard
14	female	group B	master's degree	standard
15	female	group B	master's degree	standard
16	female	group B	master's degree	standard
17	female	group B	master's degree	standard
18	female	group B	master's degree	standard
19	female	group B	master's degree	standard
20	female	group B	master's degree	standard
21	female	group B	master's degree	standard
22	female	group B	master's degree	standard
23	female	group B	master's degree	standard
24	female	group B	master's degree	standard
25	female	group B	master's degree	standard
26	female	group B	master's degree	standard
27	female	group B	master's degree	standard
28	female	group B	master's degree	standard
29	female	group B	master's degree	standard
30	female	group B	master's degree	standard
31	female	group B	master's degree	standard
32	female	group B	master's degree	standard
33	female	group B	master's degree	standard
34	female	group B	master's degree	standard
35	female	group B	master's degree	standard
36	female	group B	master's degree	standard
37	female	group B	master's degree	standard
38	female	group B	master's degree	standard
39	female	group B	master's degree	standard
40	female	group B	master's degree	standard
41	female	group B	master's degree	standard
42	female	group B	master's degree	standard
43	female	group B	master's degree	standard
44	female	group B	master's degree	standard
45	female	group B	master's degree	standard
46	female	group B	master's degree	standard
47	female	group B	master's degree	standard
48	female	group B	master's degree	standard
49	female	group B	master's degree	standard
50	female	group B	master's degree	standard
51	female	group B	master's degree	standard
52	female	group B	master's degree	standard
53	female	group B	master's degree	standard
54	female	group B	master's degree	standard
55	female	group B	master's degree	standard
56	female	group B	master's degree	standard
57	female	group B	master's degree	standard
58	female	group B	master's degree	standard
59	female	group B	master's degree	standard
60	female	group B	master's degree	standard
61	female	group B	master's degree	standard
62	female	group B	master's degree	standard
63	female	group B	master's degree	standard
64	female	group B	master's degree	standard
65	female	group B	master's degree	standard
66	female	group B	master's degree	standard
67	female	group B	master's degree	standard
68	female	group B	master's degree	standard
69	female	group B	master's degree	standard
70	female	group B	master's degree	standard
71	female	group B	master's degree	standard
72	female	group B	master's degree	standard
73	female	group B	master's degree	standard
74	female	group B	master's degree	standard
75	female	group B	master's degree	standard
76	female	group B	master's degree	standard
77	female	group B	master's degree	standard
78	female	group B	master's degree	standard
79	female	group B	master's degree	standard
80	female	group B	master's degree	standard
81	female	group B	master's degree	standard
82	female	group B	master's degree	standard
83	female	group B	master's degree	standard
84	female	group B	master's degree	standard
85	female	group B	master's degree	standard
86	female	group B	master's degree	standard
87	female	group B	master's degree	standard
88	female	group B	master's degree	standard
89	female	group B	master's degree	standard
90	female	group B	master's degree	standard
91	female	group B	master's degree	standard
92	female	group B	master's degree	standard
93	female	group B	master's degree	standard
94	female	group B	master's degree	standard
95	female	group B	master's degree	standard
96	female	group B	master's degree	standard
97	female	group B	master's degree	standard
98	female	group B	master's degree	standard
99	female	group B	master's degree	standard

1	69	90	88
2	90	95	93

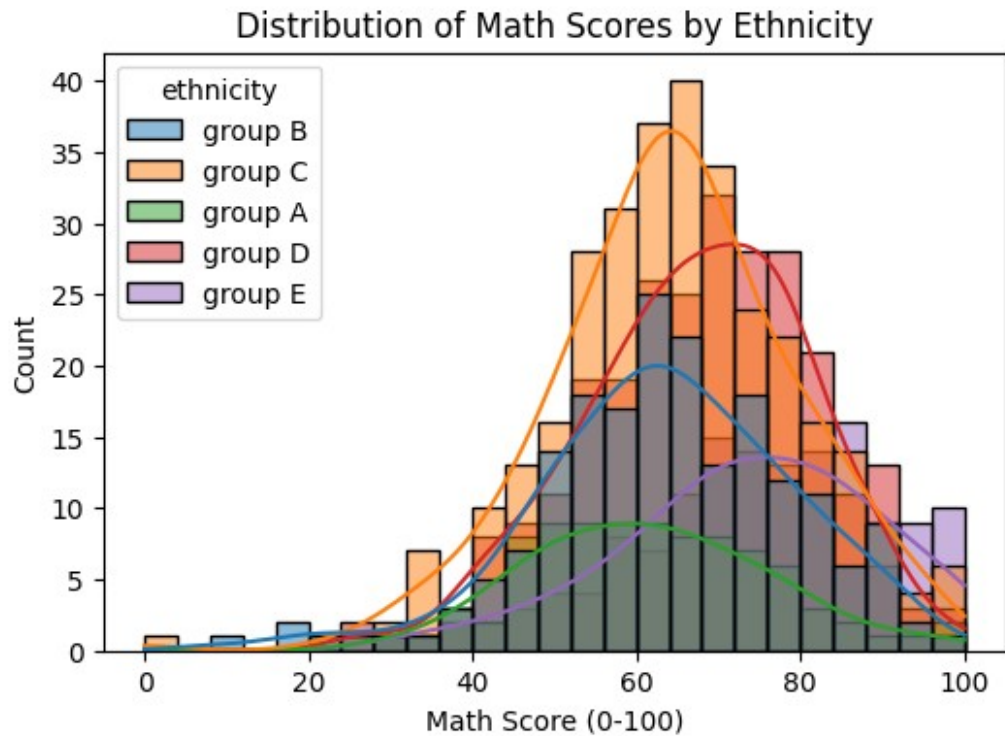
```
# How to visualize math_score distribution across gender
plt.figure(figsize=(6,4))
sns.histplot(data=df, x='math_score', hue='gender',
             palette={'female':'hotpink', 'male':'blue'},
             kde=True)
plt.show()
```



```
plt.figure(figsize=(6,4))
sns.histplot(data=df, x='math_score', hue='ethnicity',
             kde=True)

plt.title('Distribution of Math Scores by Ethnicity')
plt.xlabel('Math Score (0-100)')
plt.ylabel('Count')

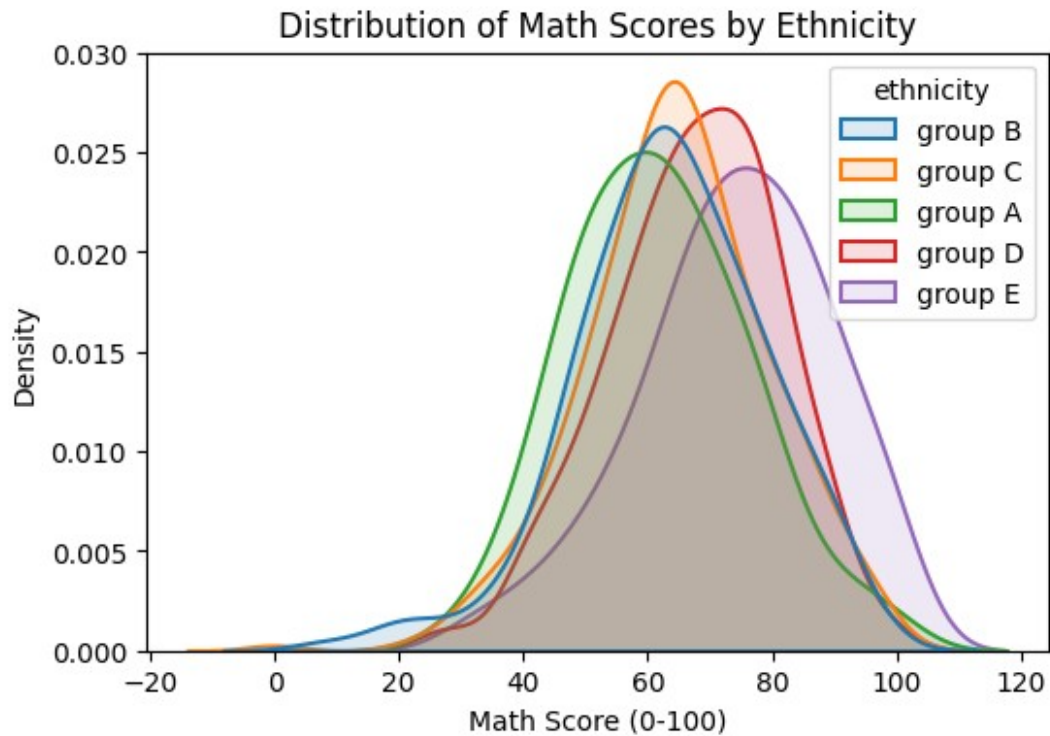
plt.show()
```



```
plt.figure(figsize=(6,4))
sns.kdeplot(data=df, x='math_score', hue='ethnicity',
            fill=True, common_norm=False,
            alpha=0.15,
            linewidth=1.5)

plt.title('Distribution of Math Scores by Ethnicity')
plt.xlabel('Math Score (0-100)')
plt.ylabel('Density')

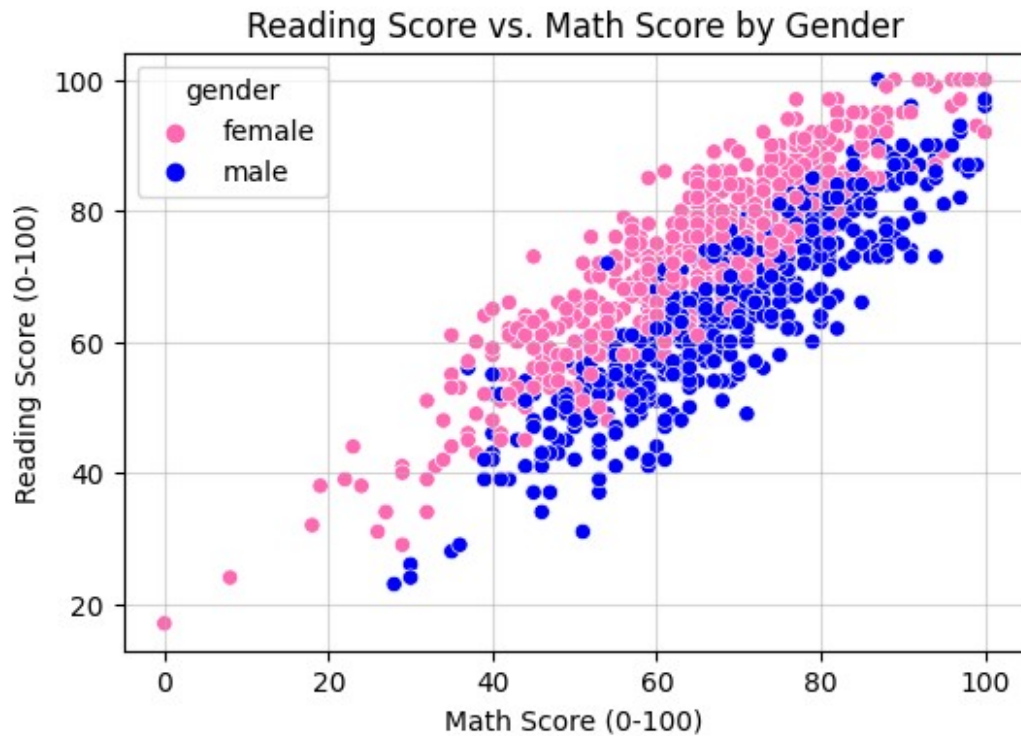
plt.show()
```



```
plt.figure(figsize=(6,4))
sns.scatterplot(df, x='math_score', y='reading_score',
                hue='gender',
                palette={'male':'blue','female':'hotpink'})
plt.grid(True, alpha=0.5)

plt.title('Reading Score vs. Math Score by Gender')
plt.xlabel('Math Score (0-100)')
plt.ylabel('Reading Score (0-100)')

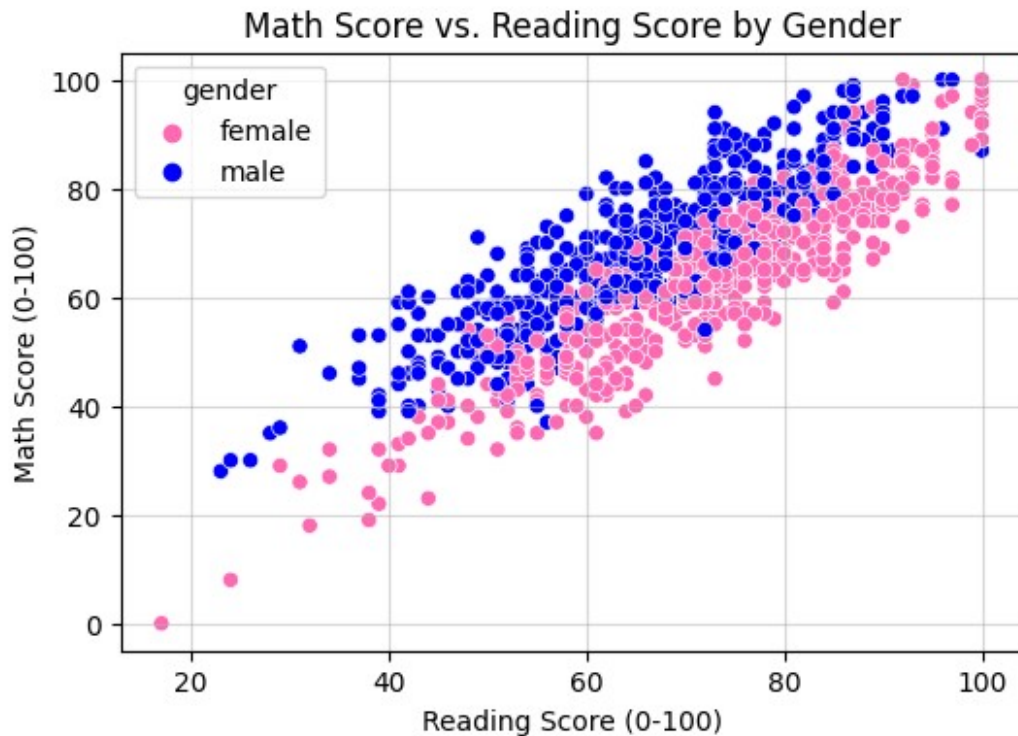
plt.show()
```



```
plt.figure(figsize=(6,4))
sns.scatterplot(df, x='reading_score', y='math_score',
                hue='gender',
                palette={'male':'blue','female':'hotpink'})
plt.grid(True, alpha=0.5)

plt.title('Math Score vs. Reading Score by Gender')
plt.xlabel('Reading Score (0-100)')
plt.ylabel('Math Score (0-100)')

plt.show()
```

```
df = pd.read_csv('annual_gold.csv')
df.tail(3)
```

	Date	Gold	Platinum
31	2017-12	1265.674	950.49
32	2018-12	1249.887	882.18
33	2019-12	1480.025	868.04

```
# We change the data type of Date from object to datetime
df['Date'] = pd.to_datetime(df['Date'])
df.head(1)
```

	Date	Gold	Platinum
0	1986-12-01	391.595	465.29

```
df['Year'] = df['Date'].dt.year
df.head(1)
```

	Date	Gold	Platinum	Year
0	1986-12-01	391.595	465.29	1986

```
plt.figure(figsize=(9,5))
```

```
#-----
```

```
# Platinum
```

```
sns.lineplot(data=df, x='Date', y='Platinum', label='Platinum')
```

```
plt.fill_between(x=df['Date'], y1=df['Platinum'], color='#999999',  
alpha=0.95)
```

```
#-----  
-----
```

```
# Gold
```

```
plt.plot_date(x=df['Date'], y=df['Gold'], linestyle='-',  
color='#ff8000', linewidth=2, marker=',',  
label='Gold')
```

```
plt.fill_between(x=df['Date'], y1=df['Gold'], color='#ffb300',  
alpha=0.85)
```

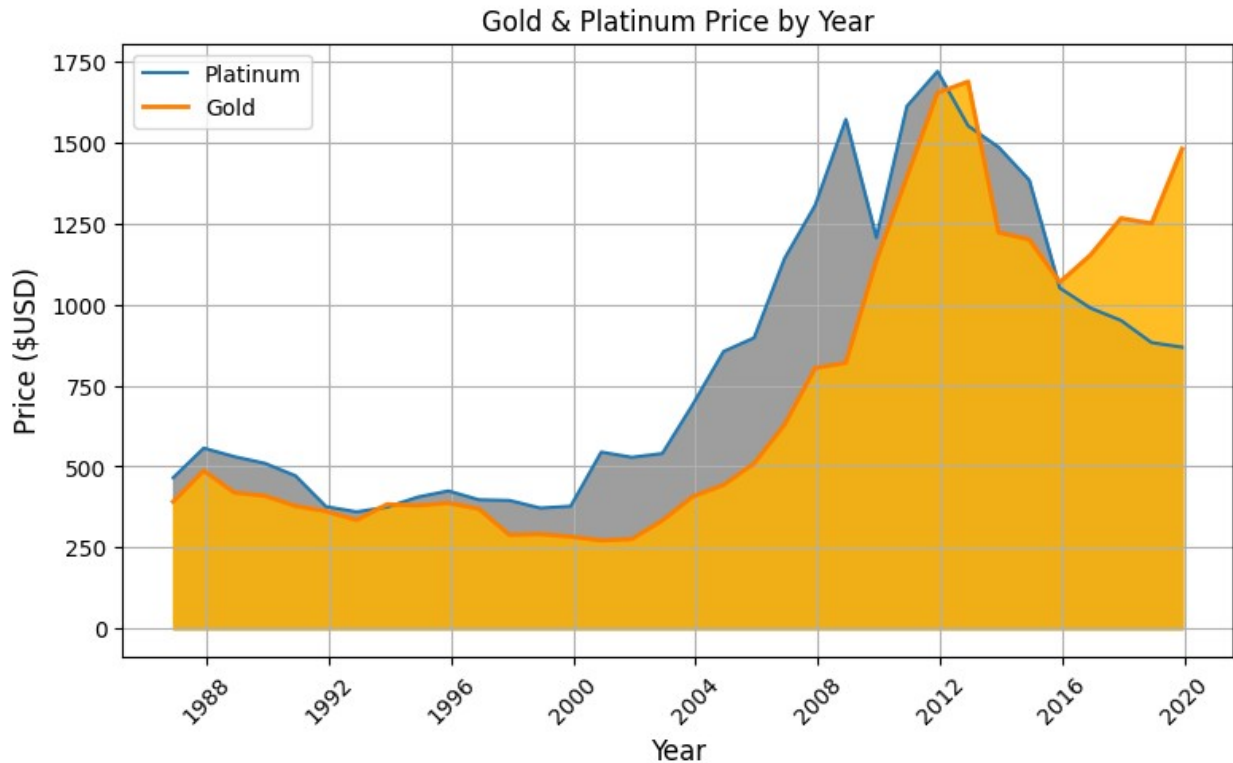
```
#-----  
-----
```

```
plt.xticks(rotation=45)  
plt.xlabel('Year', size=12)  
plt.ylabel('Price ($USD)', size=12)  
plt.title('Gold & Platinum Price by Year')
```

```
plt.legend(loc = 'upper left')  
plt.grid(True)  
plt.show()
```

```
<ipython-input-50-7d3b479df9ae>:12: UserWarning: marker is redundantly  
defined by the 'marker' keyword argument and the fmt string "o" (->  
marker='o'). The keyword argument will take precedence.
```

```
plt.plot_date(x=df['Date'], y=df['Gold'], linestyle='-',
```



```
#%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

Building a Regression Model

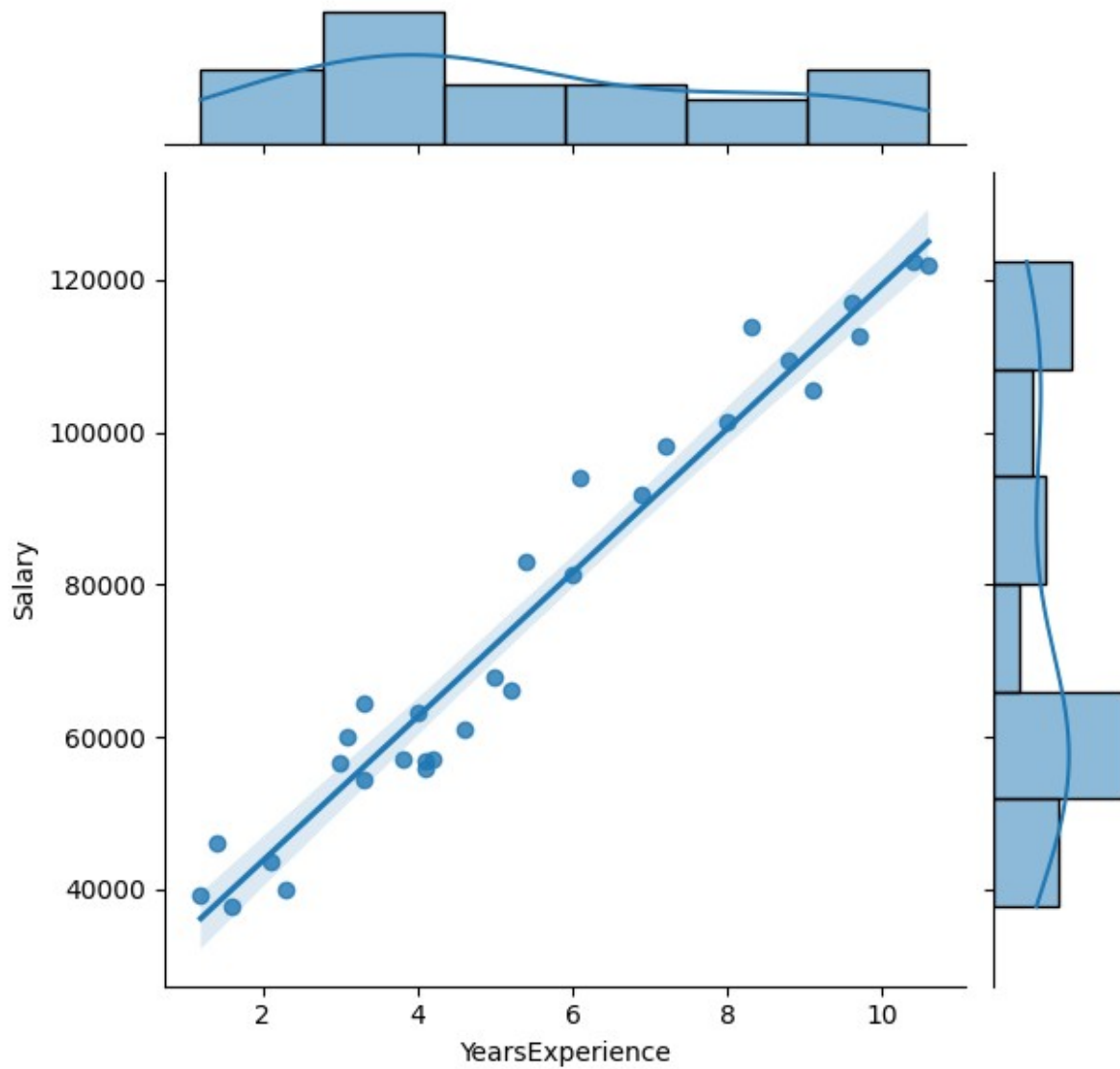
```
df = pd.read_csv('salary.csv')
df.head(3)
```

	YearsExperience	Salary
0	1.2	39344
1	1.4	46206
2	1.6	37732

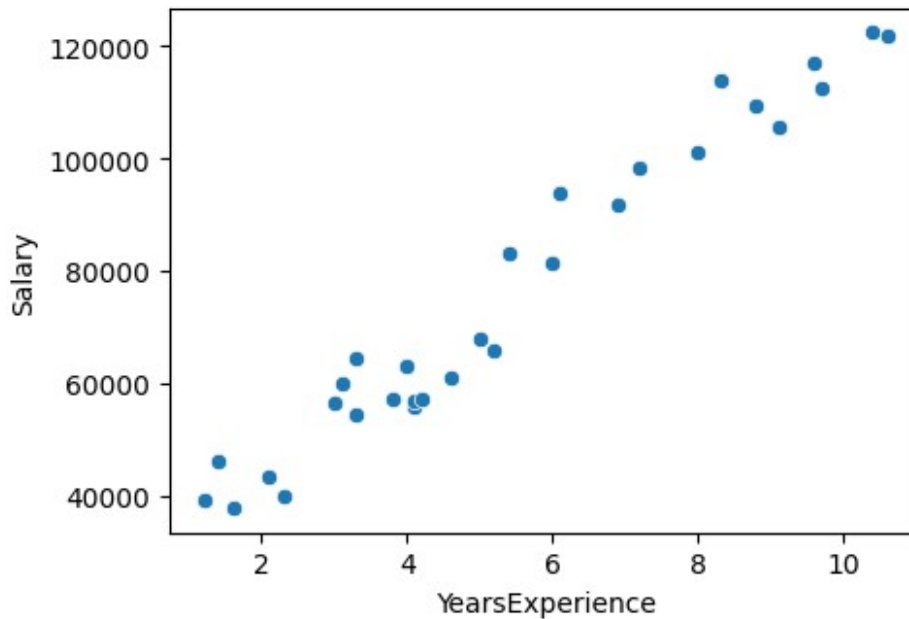
```
# Creating a jointplot to explore the relationship between experience and salary
```

```
plt.figure(figsize=(6,6))
sns.jointplot(data=df, x='YearsExperience', y='Salary', kind='reg')
plt.show()
```

```
<Figure size 600x600 with 0 Axes>
```



```
# Displaying the relationship between x and y using scatterplot
plt.figure(figsize=(5,3.5))
sns.scatterplot(data=df, x='YearsExperience', y='Salary')
plt.show()
```



```
# Model building

# Double brackets creates a pandas dataframe
x = df[['YearsExperience']]
y = df[['Salary']]

# Split the data
x_train, x_test, y_train, y_test = train_test_split(x, y,
test_size=0.1)

regr = linear_model.LinearRegression()
regr.fit(x_train, y_train)

LinearRegression()

# Model prediction
y_pred = regr.predict(x_test)
y_pred

array([[ 99711.56993733],
       [ 37375.87620897],
       [102545.01056134]])

np.sqrt(mean_squared_error(y_test, y_pred))

8316.075232121839

r2_score(y_test, y_pred)

0.9198218331733488
```

```
# Visualizing the model

plt.figure(figsize=(6,4))

sns.scatterplot(data=df, x='YearsExperience', y='Salary')
plt.plot(x_train, regr.predict(x_train), color='gold')

plt.title('Salary vs. Experience')
plt.xlabel('Experience (Years)')
plt.ylabel('Salary ($USD)')

plt.grid(True, alpha=0.45)
plt.show()
```



```
print('slope:', regr.coef_)
print('intercept:', regr.intercept_)
```

```
slope: [[9444.80208005]]
intercept: [24153.1532969]
```

```
# Model:
#  $y = 24153 + 9445x$ 
```

#

The following selection of visualizations appear in a final consumer analysis project for a data visualization class I completed at CSU Northridge. For the sake of brevity, I did not transfer over the lengthy analysis portion, nor all the visualizations, although the project in its entirety can be provided if needed.

```
df = pd.read_csv('Customers.csv')
df.head(3)
```

	CustomerID	Gender	Age	Annual Income (\$)	Spending Score (1-100)
0	1	Male	19	15000	39
1	2	Male	21	35000	81
2	3	Female	20	86000	6

	Profession	Work Experience	Family Size
0	Healthcare	1	4
1	Engineer	3	3
2	Engineer	1	1

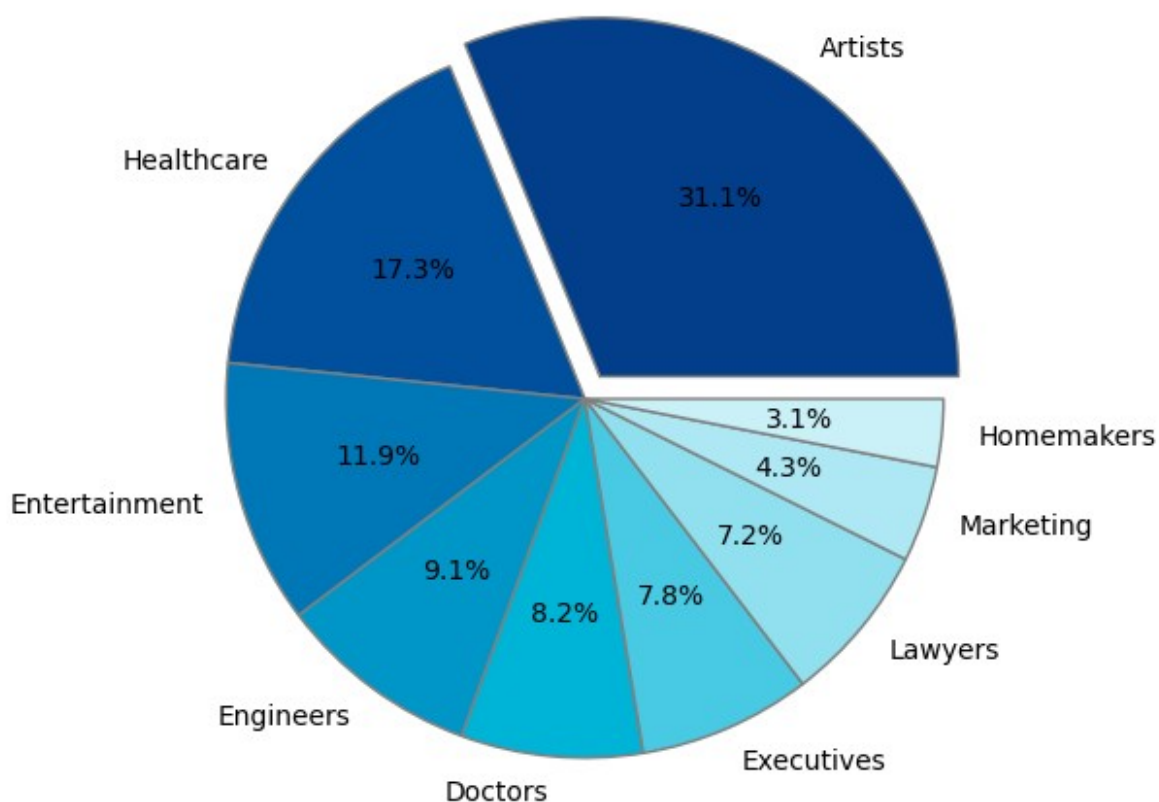
```
profession = df['Profession'].value_counts().tolist()
labels = ['Artists', 'Healthcare', 'Entertainment', 'Engineers',
'Doctors', 'Executives', 'Lawyers', 'Marketing', 'Homemakers']
colors = ['#023e8a', '#00509d', '#0077b6', '#0096c7', '#00b4d8',
'#48cae4', '#90e0ef', '#ade8f4', '#caf0f8']
explode = (0.075, 0, 0, 0, 0, 0, 0, 0, 0)

plt.figure(figsize=(6,6))

plt.pie(profession, labels=labels, colors=colors, autopct='%1.1f%%',
explode=explode, wedgeprops={'linewidth':1,
'edgecolor':'grey'})

plt.title('Representation of Professions in Customers Dataset')
plt.show()
```

Representation of Professions in Customers Dataset

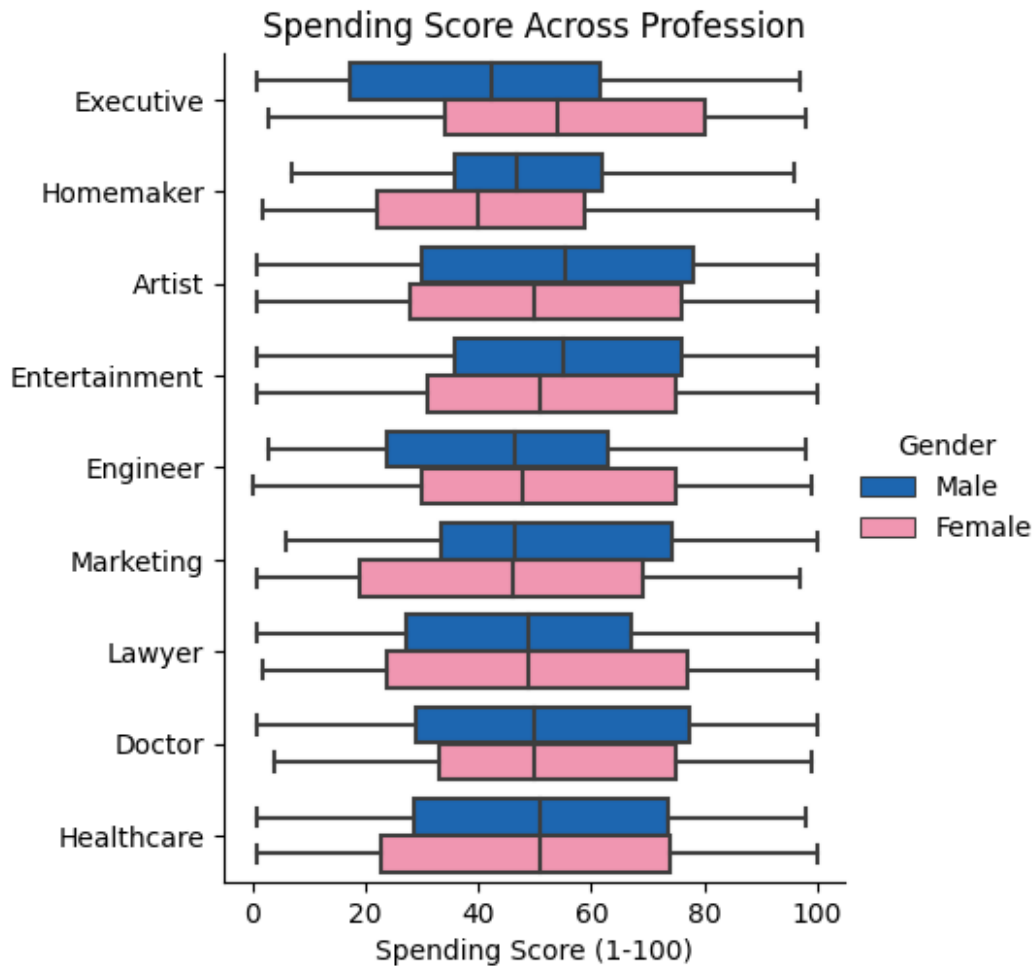


```
plt.figure(figsize=(6,4))
profession_order = ['Executive', 'Homemaker', 'Artist',
                    'Entertainment', 'Engineer', 'Marketing', 'Lawyer', 'Doctor',
                    'Healthcare']

sns.catplot(data=df, x='Spending Score (1-100)', y='Profession',
            kind='box', hue='Gender',
            palette={'Female': '#ff87ab', 'Male': '#0466c8'},
            orient='h', order=profession_order)

plt.ylabel('')
plt.title('Spending Score Across Profession')
plt.show()
```

<Figure size 600x400 with 0 Axes>



```

a = set(['Artists', 'Healthcare', 'Entertainment'])
b = set(['Executives', 'Healthcare', 'Entertainment'])

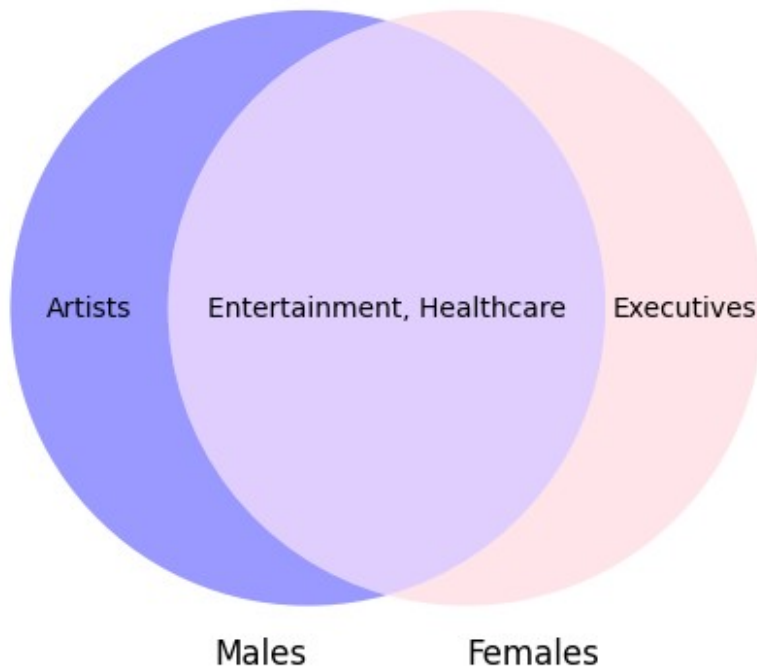
ven = venn2(subsets=(a,b), set_labels=('Males', 'Females'),
            set_colors=('blue', 'pink'))

ven.get_label_by_id('10').set_text(', '.join(a-b))
ven.get_label_by_id('11').set_text(', '.join(a&b))
ven.get_label_by_id('01').set_text(', '.join(b-a))

plt.title('Top 3 Highest Spending Professions by Gender')
plt.show()

```

Top 3 Highest Spending Professions by Gender



```
# Define the specific bins for income and spending score
income_bins = [0, 30000, 60000, 90000, 120000, 150000]
spending_bins = [0, 20, 40, 60, 80, 100]

# Create the 2D histogram with swapped axes
hist_swapped, spending_edges, income_edges =
np.histogram2d( df['Annual Income ($)'], df['Spending Score (1-100)'],
bins=[income_bins, spending_bins])

# Normalize the swapped histogram
normalized_hist_swapped = (hist_swapped / hist_swapped.max()) * 100

# Create the figure and axis for the heatmap with swapped axes
plt.figure(figsize=(1,1))
fig, ax = plt.subplots(figsize=(8,6.5))

# Create the heatmap with swapped axes
sns.heatmap(normalized_hist_swapped,
            xticklabels=['0-30k', '30k-60k', '60k-90k', '90k-120k',
'120k-150k'],
            yticklabels=['81-100', '61-80', '41-60', '21-40', '0-20'],
            cmap='Blues',
            ax=ax,
            annot=True,
            fmt=".1f",
```

```

linewidths=.5,
cbar_kws={'label': 'Normalized Density (%)'})

# Add titles and labels with axes swapped
plt.title('Customer Density by Spending Score and Annual Income',
          fontsize=18, fontweight='bold')
plt.xlabel('Annual Income Range', fontsize=14, fontweight='bold')
plt.ylabel('Spending Score Range', fontsize=14, fontweight='bold')
plt.show()

<Figure size 100x100 with 0 Axes>

```

Customer Density by Spending Score and Annual Income

