# **Logistic Regression Project**

About the project; This is a fake advertising data set, indicating whether or not a particular internet user clicked on an Advertisement on a company website.

#### It was gotten from Pierian Data.

This data set contains the following features:

- 1. Daily Time Spent on Site': consumer time on site in minutes
- 2. Age: cutomer age in years
- 3. Area Income': Avg. Income of geographical area of consumer
- 4. Daily Internet Usage': Avg. minutes a day consumer is on the internet
- 5. Ad Topic Line': Headline of the advertisement
- 6. City: City of consumer
- 7. Male: Whether or not consumer was male
- 8. Country: Country of consumer
- 9. Timestamp: Time at which consumer clicked on Ad or closed window
- 10. Clicked on Ad': 0 or 1 indicated clicking on Ad

### **Analysing Data**



## **Imprtoing Libraries**

```
In [1]:
         import pandas as pd
         import seaborn as sns
         import numpy as np
         import matplotlib.pyplot as plt
         %matplotlib inline
In [2]:
         ad_data = pd.read_csv('advertising.csv')
In [3]:
         ad_data.head ()
Out[3]:
             Daily Time Spent on
                                                   Daily Internet
                                                                                                                                      Clicked on
                                          Area
                                                                              Ad Topic Line
                                                                                                 City Male Country
                                                                                                                          Timestamp
                          Site
                                        Income
                                                         Usage
                                                                                                                                            Ad
```

	Daily Time Spent on Site	Age	Area Income	Daily Internet Usage	Ad Topic Line	City	Male	Country	Timestamp	Clicked on Ad
0	68.95	35	61833.90	256.09	Cloned 5thgeneration orchestration	Wrightburgh	0	Tunisia	2016-03-27 00:53:11	0
1	80.23	31	68441.85	193.77	Monitored national standardization	West Jodi	1	Nauru	2016-04-04 01:39:02	0
2	69.47	26	59785.94	236.50	Organic bottom-line service- desk	Davidton	0	San Marino	2016-03-13 20:35:42	0
3	74.15	29	54806.18	245.89	Triple-buffered reciprocal time- frame	West Terrifurt	1	Italy	2016-01-10 02:31:19	0
4	68.37	35	73889.99	225.58	Robust logistical utilization	South Manuel	0	Iceland	2016-06-03 03:36:18	0

In [4]:

ad\_data.tail()

Out[4]:

Daily Time Spent on Site	Age	Area Income	Daily Internet Usage	Ad Topic Line	City	Male	Country	Timestamp	Clicked on Ad
72.97	30	71384.57	208.58	Fundamental modular algorithm	Duffystad	1	Lebanon	2016-02-11 21:49:00	1
51.30	45	67782.17	134.42	Grass-roots cohesive monitoring	New Darlene	1	Bosnia and Herzegovina	2016-04-22 02:07:01	1
51.63	51	42415.72	120.37	Expanded intangible solution	South Jessica	1	Mongolia	2016-02-01 17:24:57	1
55.55	19	41920.79	187.95	Proactive bandwidth- monitored policy	West Steven	0	Guatemala	2016-03-24 02:35:54	0
45.01	26	29875.80	178.35	Virtual 5thgeneration emulation	Ronniemouth	0	Brazil	2016-06-03 21:43:21	1
	on Site  72.97  51.30  51.63  55.55	72.97 30 51.30 45 51.63 51 55.55 19	on Site         Age         Income           72.97         30         71384.57           51.30         45         67782.17           51.63         51         42415.72           55.55         19         41920.79	on Site         Age         Income         Usage           72.97         30         71384.57         208.58           51.30         45         67782.17         134.42           51.63         51         42415.72         120.37           55.55         19         41920.79         187.95	non Site Age Income Usage Ad Topic Line  72.97 30 71384.57 208.58 Fundamental modular algorithm  51.30 45 67782.17 134.42 Grass-roots cohesive monitoring  51.63 51 42415.72 120.37 Expanded intangible solution  55.55 19 41920.79 187.95 Proactive bandwidth-monitored policy  45.01 26 29875.80 178.35 Virtual 5thgeneration	Ton Site Age Income Usage Ad Topic Line City  72.97 30 71384.57 208.58 Fundamental modular algorithm Duffystad  51.30 45 67782.17 134.42 Grass-roots cohesive monitoring New Darlene  51.63 51 42415.72 120.37 Expanded intangible solution South Jessica  55.55 19 41920.79 187.95 Proactive bandwidthmonitored policy West Steven	Ton Site Age Income Usage Ad Topic Line City Male  72.97 30 71384.57 208.58 Fundamental modular algorithm Duffystad 1  51.30 45 67782.17 134.42 Grass-roots cohesive monitoring New Darlene 1  51.63 51 42415.72 120.37 Expanded intangible solution South Jessica 1  55.55 19 41920.79 187.95 Proactive bandwidthmonitored policy West Steven 0  Virtual 5thgeneration Representation Repres	Ton Site Age Income Usage Ad Topic Line City Male Country  72.97 30 71384.57 208.58 Fundamental modular algorithm Duffystad 1 Lebanon  51.30 45 67782.17 134.42 Grass-roots cohesive monitoring New Darlene 1 Bosnia and Herzegovina  51.63 51 42415.72 120.37 Expanded intangible solution South Jessica 1 Mongolia  55.55 19 41920.79 187.95 Proactive bandwidth-monitored policy West Steven 0 Guatemala	New Darlene   South Jessica   New Darlene   South Jessica   Mongolia   South Jessica   Mongolia   South Jessica   Mongolia   South Jessica   South Jessica

In [5]

ad\_data.info ()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1000 entries, 0 to 999

Out[6]:

```
Data columns (total 10 columns):
                              Non-Null Count Dtype
    Column
                              _____
    Daily Time Spent on Site 1000 non-null
                                             float64
    Age
 1
                              1000 non-null
                                            int64
    Area Income
                              1000 non-null
                                            float64
    Daily Internet Usage
                              1000 non-null
                                            float64
    Ad Topic Line
                             1000 non-null
                                             object
 5
                              1000 non-null
    City
                                             object
    Male
                              1000 non-null
                                             int64
 7
    Country
                             1000 non-null
                                             object
    Timestamp
                              1000 non-null
                                             object
    Clicked on Ad
                             1000 non-null
                                             int64
dtypes: float64(3), int64(3), object(4)
memory usage: 78.2+ KB
```

```
In [6]: ad_data. describe ()
```

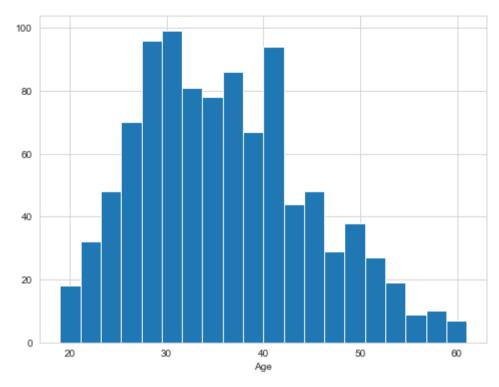
	<b>Daily Time Spent on Site</b>	Age	Area Income	Daily Internet Usage	Male	Clicked on Ad
count	1000.000000	1000.000000	1000.000000	1000.000000	1000.000000	1000.00000
mean	65.000200	36.009000	55000.000080	180.000100	0.481000	0.50000
std	15.853615	8.785562	13414.634022	43.902339	0.499889	0.50025
min	32.600000	19.000000	13996.500000	104.780000	0.000000	0.00000
25%	51.360000	29.000000	47031.802500	138.830000	0.000000	0.00000
50%	68.215000	35.000000	57012.300000	183.130000	0.000000	0.50000
75%	78.547500	42.000000	65470.635000	218.792500	1.000000	1.00000
max	91.430000	61.000000	79484.800000	269.960000	1.000000	1.00000

# **Exploratory Data Analysis**

Creating a histogram of the Age

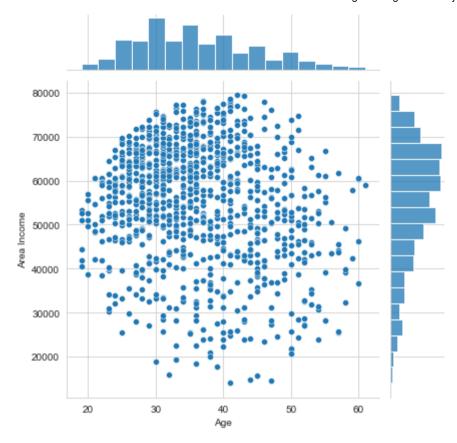
```
In [7]:
    plt.figure(figsize=(8,6))
    sns.set_style('whitegrid')
    ad_data['Age'].hist(bins=20)
    plt.xlabel('Age')
```

```
Out[7]: Text(0.5, 0, 'Age')
```

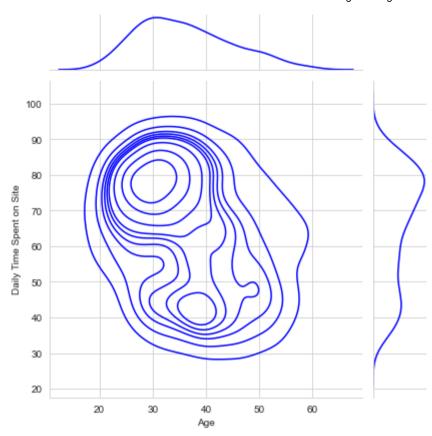


```
plt.figure(figsize=(8,6))
sns.jointplot (y='Area Income', x='Age', data=ad_data)
```

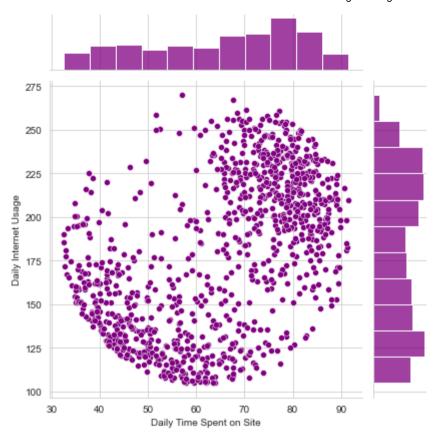
Out[8]: <seaborn.axisgrid.JointGrid at 0x16c27ab1040> <Figure size 576x432 with 0 Axes>



```
In [9]: sns.jointplot(x='Age',y='Daily Time Spent on Site',data=ad_data,color='blue',kind='kde');
```



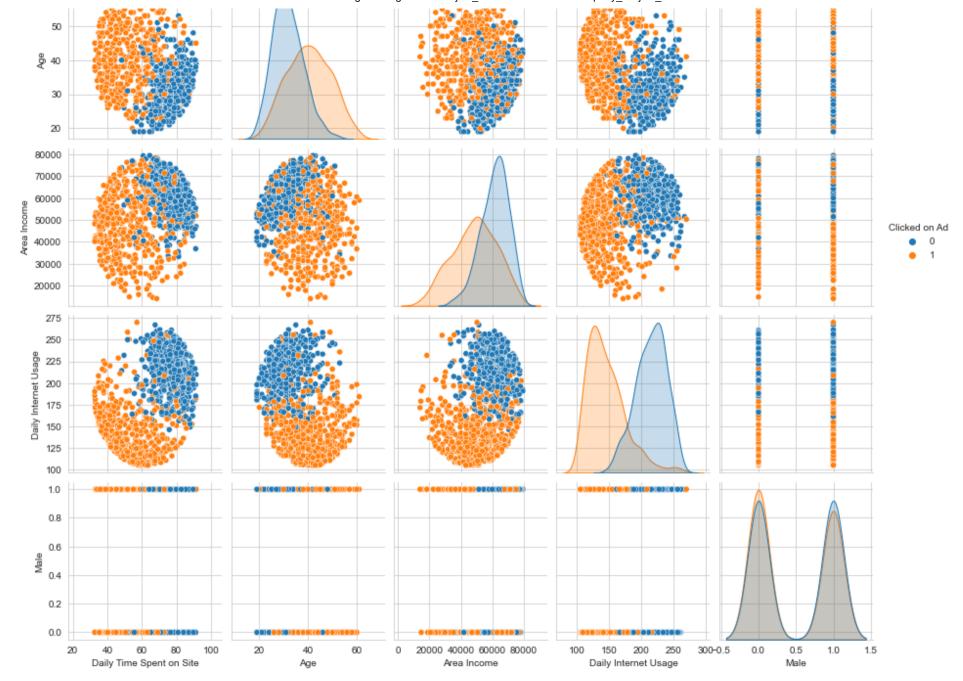
```
plt.figure(figsize=(8,6)) #plt.figure(figsize=(8,6)) sns.jointplot (x= 'Daily Time Spent on Site', y= 'Daily Internet Usage', data=ad_data, color='purple')
```



In [11]: sns.pairplot(data=ad\_data, hue='Clicked on Ad')

Out[11]: <seaborn.axisgrid.PairGrid at 0x16c27e28a30>





# **Logistic Regression**

In [ ]:

```
In [12]: from sklearn.model_selection import train_test_split

In [13]:    X = ad_data[['Daily Time Spent on Site', 'Age', 'Area Income','Daily Internet Usage', 'Male']]
    y = ad_data['Clicked on Ad']

In [14]:    X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3, random_state=101)

In [15]:    from sklearn.linear_model import LogisticRegression

In [16]:    logmodel = LogisticRegression()
    logmodel.fit(X_train, y_train)
Out[16]: LogisticRegression()
```

### **Predictions and Evaluations**

```
In [17]:
          predictions = logmodel.predict(X test)
In [19]:
          from sklearn.metrics import classification report,confusion matrix
          print(classification report(y test,predictions))
          #print(confusion martix(y test,predictions))
                        precision
                                     recall f1-score
                                                        support
                     0
                                                 0.93
                             0.91
                                       0.95
                                                            157
                     1
                             0.94
                                       0.90
                                                 0.92
                                                            143
                                                 0.93
             accuracy
                                                            300
            macro avg
                             0.93
                                       0.93
                                                 0.93
                                                            300
         weighted avg
                             0.93
                                       0.93
                                                 0.93
                                                            300
```