

```

import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import scipy as stats
for dirname, _, filenames in os.walk('/kaggle/input'):
    for filename in filenames:
        print(os.path.join(dirname, filename))

import warnings
warnings.filterwarnings('ignore')

```

```

-----
-----
NameError                                Traceback (most recent call
last)

```

```

<ipython-input-49-1fc6849cdf9> in <cell line: 6>()
      4 import seaborn as sns
      5 import scipy as stats
----> 6 for dirname, _, filenames in os.walk('/kaggle/input'):
      7     for filename in filenames:
      8         print(os.path.join(dirname, filename))

```

```
NameError: name 'os' is not defined
```

```

import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import scipy.stats as stats
import warnings
warnings.filterwarnings('ignore')

```

```

control_df =
pd.read_csv('/kaggle/input/ab-testing-dataset/control_group.csv', sep
=";")
test_df =
pd.read_csv('/kaggle/input/ab-testing-dataset/test_group.csv', sep
=";")

```

```
control_df.head()
```

|          | Campaign Name    | Date      | Spend [USD] | # of Impressions |
|----------|------------------|-----------|-------------|------------------|
| Reach \  |                  |           |             |                  |
| 0        | Control Campaign | 1.08.2019 | 2280        | 82702.0          |
| 56930.0  |                  |           |             |                  |
| 1        | Control Campaign | 2.08.2019 | 1757        | 121040.0         |
| 102513.0 |                  |           |             |                  |
| 2        | Control Campaign | 3.08.2019 | 2343        | 131711.0         |
| 110862.0 |                  |           |             |                  |
| 3        | Control Campaign | 4.08.2019 | 1940        | 72878.0          |

61235.0

4 Control Campaign 5.08.2019 1835 NaN

|   | # of Website Clicks | # of Searches | # of View Content | # of Add to Cart \ |
|---|---------------------|---------------|-------------------|--------------------|
| 0 | 7016.0              | 2290.0        | 2159.0            | 1819.0             |
| 1 | 8110.0              | 2033.0        | 1841.0            | 1219.0             |
| 2 | 6508.0              | 1737.0        | 1549.0            | 1134.0             |
| 3 | 3065.0              | 1042.0        | 982.0             | 1183.0             |
| 4 | NaN                 | NaN           | NaN               | NaN                |

|   | # of Purchase |
|---|---------------|
| 0 | 618.0         |
| 1 | 511.0         |
| 2 | 372.0         |
| 3 | 340.0         |
| 4 | NaN           |

test\_df.head()

|   | Campaign Name | Date      | Spend [USD] | # of Impressions | Reach \ |
|---|---------------|-----------|-------------|------------------|---------|
| 0 | Test Campaign | 1.08.2019 | 3008        | 39550            | 35820   |
| 1 | Test Campaign | 2.08.2019 | 2542        | 100719           | 91236   |
| 2 | Test Campaign | 3.08.2019 | 2365        | 70263            | 45198   |
| 3 | Test Campaign | 4.08.2019 | 2710        | 78451            | 25937   |
| 4 | Test Campaign | 5.08.2019 | 2297        | 114295           | 95138   |

|   | # of Website Clicks | # of Searches | # of View Content | # of Add to Cart \ |
|---|---------------------|---------------|-------------------|--------------------|
| 0 | 3038                | 1946          | 1069              | 894                |
| 1 | 4657                | 2359          | 1548              | 879                |
| 2 | 7885                | 2572          | 2367              | 1268               |
| 3 | 4216                | 2216          | 1437              | 566                |
| 4 | 5863                | 2106          | 858               | 956                |

|   | # of Purchase |
|---|---------------|
| 0 | 255           |
| 1 | 677           |
| 2 | 578           |

```
3          340
4          768
```

```
control_df.columns = ["Campaign Name", "Date", "Amount Spent",
                       "Number of Impressions", "Reach", "Website
Clicks",
                       "Searches Received", "Content Viewed", "Added
to Cart",
                       "Purchases"]
```

```
test_df.columns = ["Campaign Name", "Date", "Amount Spent",
                    "Number of Impressions", "Reach", "Website
Clicks",
                    "Searches Received", "Content Viewed", "Added
to Cart",
                    "Purchases"]
```

```
control_df.describe()
```

|          | Amount Spent | Number of Impressions | Reach         | Website     |
|----------|--------------|-----------------------|---------------|-------------|
| Clicks \ |              |                       |               |             |
| count    | 30.000000    | 29.000000             | 29.000000     | 29.000000   |
| mean     | 2288.433333  | 109559.758621         | 88844.931034  | 5320.793103 |
| std      | 367.334451   | 21688.922908          | 21832.349595  | 1757.369003 |
| min      | 1757.000000  | 71274.000000          | 42859.000000  | 2277.000000 |
| 25%      | 1945.500000  | 92029.000000          | 74192.000000  | 4085.000000 |
| 50%      | 2299.500000  | 113430.000000         | 91579.000000  | 5224.000000 |
| 75%      | 2532.000000  | 121332.000000         | 102479.000000 | 6628.000000 |
| max      | 3083.000000  | 145248.000000         | 127852.000000 | 8137.000000 |

|       | Searches Received | Content Viewed | Added to Cart | Purchases  |
|-------|-------------------|----------------|---------------|------------|
| count | 29.000000         | 29.000000      | 29.000000     | 29.000000  |
| mean  | 2221.310345       | 1943.793103    | 1300.000000   | 522.793103 |
| std   | 866.089368        | 777.545469     | 407.457973    | 185.028642 |
| min   | 1001.000000       | 848.000000     | 442.000000    | 222.000000 |
| 25%   | 1615.000000       | 1249.000000    | 930.000000    | 372.000000 |
| 50%   | 2390.000000       | 1984.000000    | 1339.000000   | 501.000000 |
| 75%   | 2711.000000       | 2421.000000    | 1641.000000   | 670.000000 |
| max   | 4891.000000       | 4219.000000    | 1913.000000   | 800.000000 |

```
test_df.describe()
```

|          | Amount Spent | Number of Impressions | Reach         | Website |
|----------|--------------|-----------------------|---------------|---------|
| Clicks \ |              |                       |               |         |
| count    | 30.000000    | 30.000000             | 30.000000     |         |
| mean     | 2563.066667  | 74584.800000          | 53491.566667  |         |
| std      | 348.687681   | 32121.377422          | 28795.775752  |         |
| min      | 1968.000000  | 22521.000000          | 10598.000000  |         |
| 25%      | 2324.500000  | 47541.250000          | 31516.250000  |         |
| 50%      | 2584.000000  | 68853.500000          | 44219.500000  |         |
| 75%      | 2836.250000  | 99500.000000          | 78778.750000  |         |
| max      | 3112.000000  | 133771.000000         | 109834.000000 |         |

|       | Searches Received | Content Viewed | Added to Cart | Purchases  |
|-------|-------------------|----------------|---------------|------------|
| count | 30.000000         | 30.000000      | 30.000000     | 30.000000  |
| mean  | 2418.966667       | 1858.000000    | 881.533333    | 521.233333 |
| std   | 388.742312        | 597.654669     | 347.584248    | 211.047745 |
| min   | 1854.000000       | 858.000000     | 278.000000    | 238.000000 |
| 25%   | 2043.000000       | 1320.000000    | 582.500000    | 298.000000 |
| 50%   | 2395.500000       | 1881.000000    | 974.000000    | 500.000000 |
| 75%   | 2801.250000       | 2412.000000    | 1148.500000   | 701.000000 |
| max   | 2978.000000       | 2801.000000    | 1391.000000   | 890.000000 |

```
control_df.isnull().sum()
```

```
Campaign Name    0
Date              0
Amount Spent      0
Number of Impressions  1
Reach             1
Website Clicks    1
Searches Received  1
Content Viewed    1
Added to Cart     1
Purchases         1
dtype: int64
```

```
control_df.iloc[:, 3:] = control_df.iloc[:,
3:].fillna(control_df.iloc[:, 3:].median())
```

```
test_df.isnull().sum()
```

```
Campaign Name    0
Date              0
```

```
Amount Spent          0
Number of Impressions 0
Reach                 0
Website Clicks        0
Searches Received     0
Content Viewed        0
Added to Cart         0
Purchases             0
dtype: int64
```

```
control_df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 30 entries, 0 to 29
```

```
Data columns (total 10 columns):
```

| # | Column                | Non-Null Count | Dtype   |
|---|-----------------------|----------------|---------|
| 0 | Campaign Name         | 30 non-null    | object  |
| 1 | Date                  | 30 non-null    | object  |
| 2 | Amount Spent          | 30 non-null    | int64   |
| 3 | Number of Impressions | 30 non-null    | float64 |
| 4 | Reach                 | 30 non-null    | float64 |
| 5 | Website Clicks        | 30 non-null    | float64 |
| 6 | Searches Received     | 30 non-null    | float64 |
| 7 | Content Viewed        | 30 non-null    | float64 |
| 8 | Added to Cart         | 30 non-null    | float64 |
| 9 | Purchases             | 30 non-null    | float64 |

```
dtypes: float64(7), int64(1), object(2)
```

```
memory usage: 2.5+ KB
```

```
test_df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 30 entries, 0 to 29
```

```
Data columns (total 10 columns):
```

| # | Column                | Non-Null Count | Dtype  |
|---|-----------------------|----------------|--------|
| 0 | Campaign Name         | 30 non-null    | object |
| 1 | Date                  | 30 non-null    | object |
| 2 | Amount Spent          | 30 non-null    | int64  |
| 3 | Number of Impressions | 30 non-null    | int64  |
| 4 | Reach                 | 30 non-null    | int64  |
| 5 | Website Clicks        | 30 non-null    | int64  |
| 6 | Searches Received     | 30 non-null    | int64  |
| 7 | Content Viewed        | 30 non-null    | int64  |
| 8 | Added to Cart         | 30 non-null    | int64  |
| 9 | Purchases             | 30 non-null    | int64  |

```
dtypes: int64(8), object(2)
```

```
memory usage: 2.5+ KB
```

```

control_df['Date']=pd.to_datetime(control_df['Date'], format="%d.%m.%Y")
test_df['Date']=pd.to_datetime(test_df['Date'], format="%d.%m.%Y")

columns_to_convert=["Amount Spent",
                    "Number of Impressions", "Reach", "Website Clicks",
                    "Searches Received", "Content Viewed", "Added to Cart",
                    "Purchases"]
control_df[columns_to_convert]=control_df[columns_to_convert].astype('int64')

control_df['Click Through Rate'] = round(100*control_df['Website Clicks'] / control_df['Number of Impressions'],2)
control_df['Conversion Rate'] =round(100* control_df['Purchases'] / control_df['Website Clicks'],2)

test_df['Click Through Rate'] = round(100*test_df['Website Clicks'] / test_df['Number of Impressions'],2)
test_df['Conversion Rate'] =round(100* test_df['Purchases'] / test_df['Website Clicks'],2)

```

**Which Campaign platform is more effective interms of clicks and conversions**

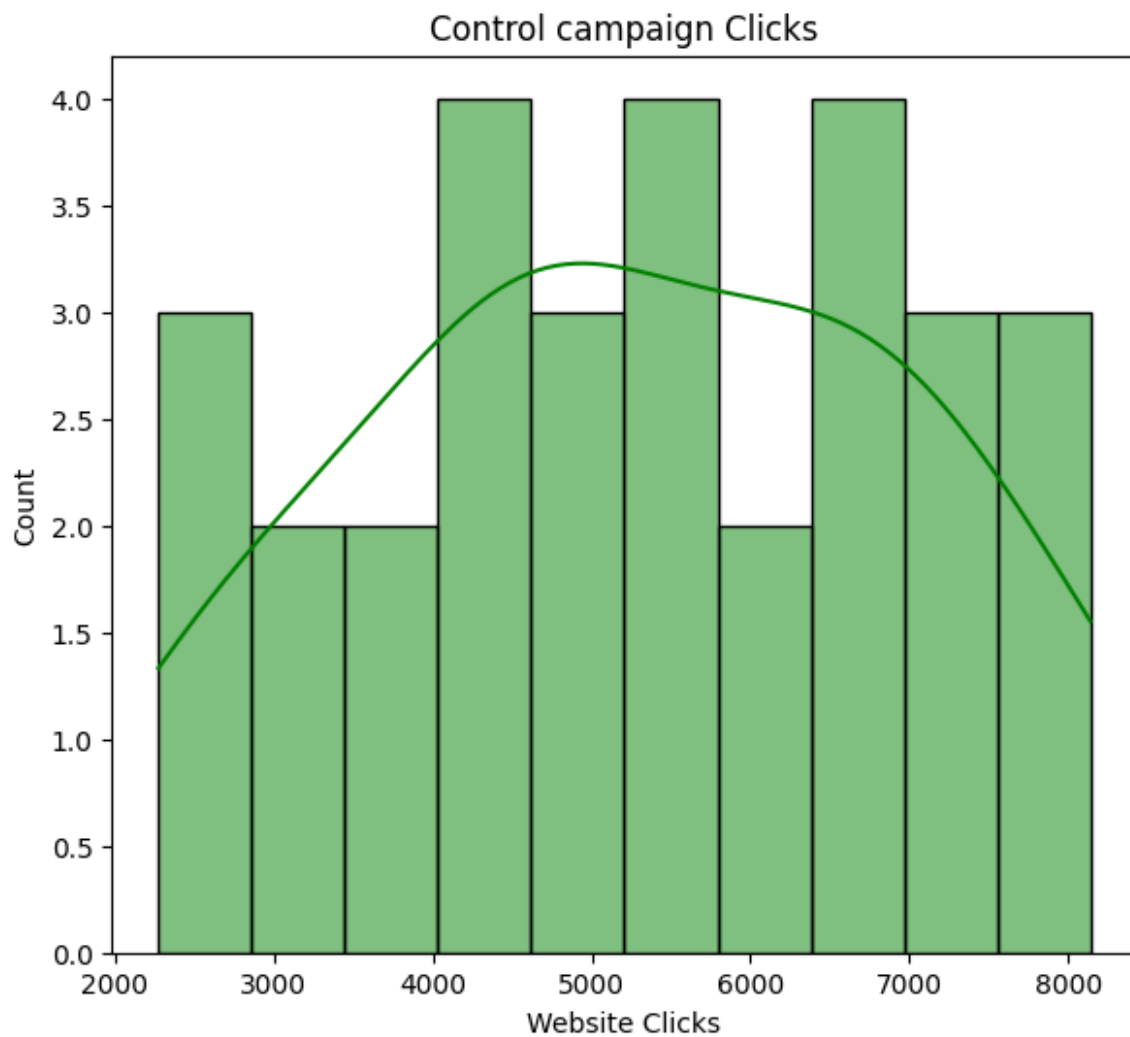
```

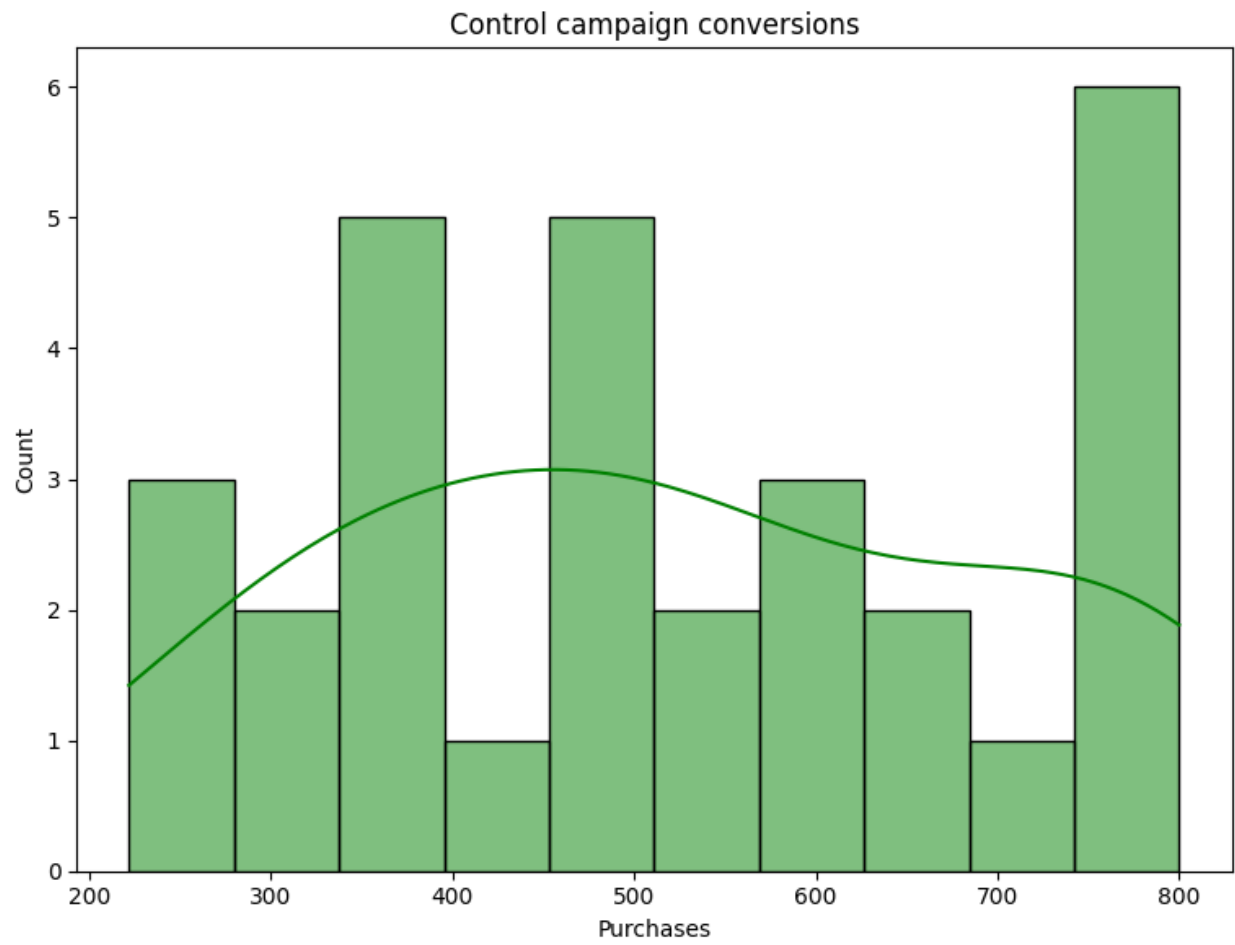
#distribution of clicks ad purchases for Control Campaign
plt.figure(figsize=(15,6))
plt.subplot(1,2,1)
plt.title("Control campaign Clicks")
sns.histplot(control_df['Website Clicks'],bins=10,edgecolor='k',color="green",kde=True)
plt.figure(figsize=(15,6))
plt.subplot(1,2,2)
plt.title("Control campaign conversions")
sns.histplot(control_df['Purchases'],bins=10,edgecolor='k',color="green",kde=True)
plt.tight_layout()
plt.show()

#distribution of clicks ad purchases for Test campaign
plt.figure(figsize=(15,6))
plt.subplot(1,2,1)
plt.title("Test campaign Clicks")
sns.histplot(test_df['Website Clicks'],bins=10,edgecolor='k',color="green",kde=True)
plt.figure(figsize=(15,6))
plt.subplot(1,2,2)
plt.title("Test campaign conversions")
sns.histplot(test_df['Purchases'],bins=10,edgecolor='k',color="green",

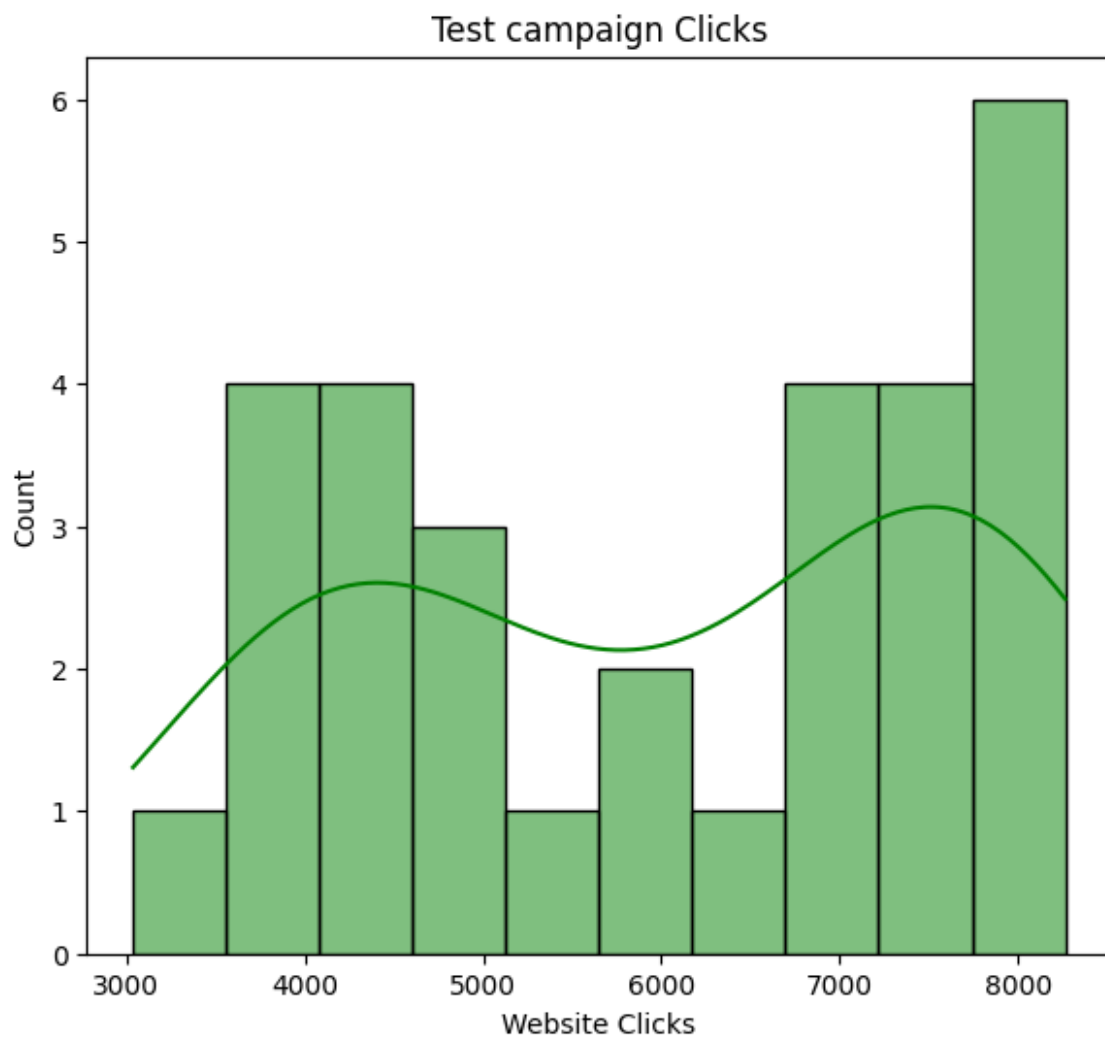
```

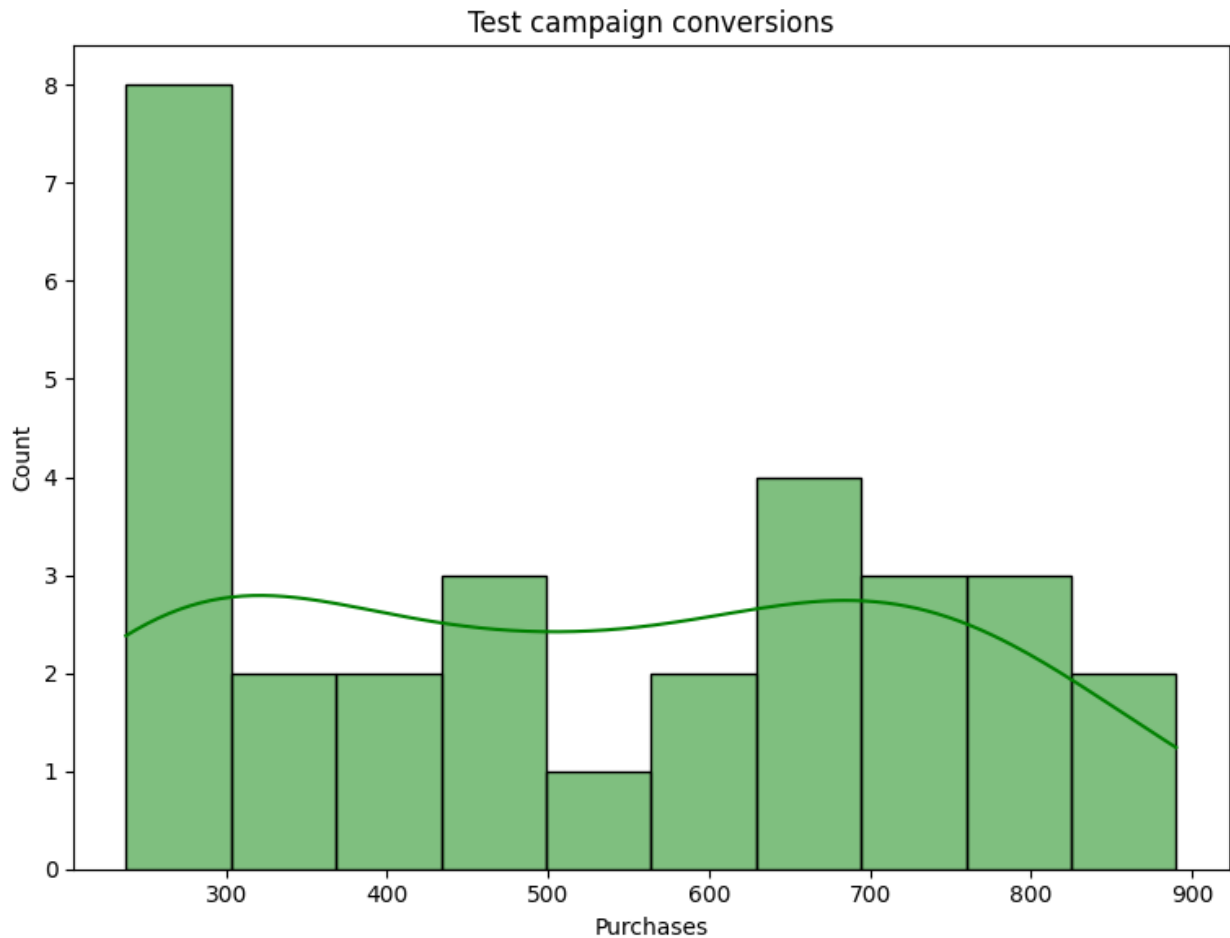
```
kde=True)  
plt.tight_layout()  
plt.show()
```











**Does Campaign Control or Campaign Test achieve a higher click-through rate?**

```
sum1= control_df['Click Through Rate']
sum2=test_df['Click Through Rate']
average_metrics1 = pd.DataFrame({
    'Metric': ['Control_df'],
    'Value': [sum1.sum()]
})

average_metrics2 = pd.DataFrame({
    'Metric': ['test_df'],
    'Value': [sum2.sum()]
})

combined_metrics = pd.concat([average_metrics1, average_metrics2],
ignore_index=True)
combined_metrics
```

|   | Metric     | Value  |
|---|------------|--------|
| 0 | Control_df | 152.38 |
| 1 | test_df    | 307.25 |

```

Total1= control_df['Conversion Rate']
Total2=test_df['Conversion Rate']
average_metrics1 = pd.DataFrame({
    'Metric': ['Control_df'],
    'Value': [Total1.sum()]
})

average_metrics2 = pd.DataFrame({
    'Metric': ['test_df'],
    'Value': [Total2.sum()]
})

combined_metrics2 = pd.concat([average_metrics1, average_metrics2],
ignore_index=True)
combined_metrics2

```

|   | Metric     | Value  |
|---|------------|--------|
| 0 | Control_df | 342.44 |
| 1 | test_df    | 276.92 |

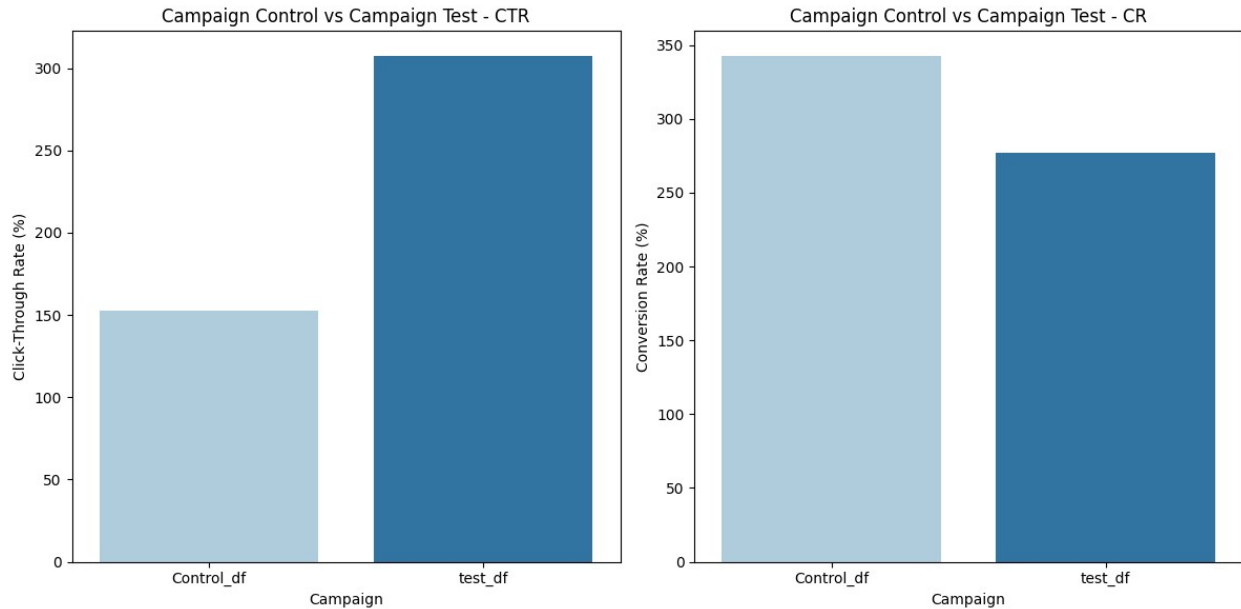
```

plt.figure(figsize=(12, 6))
plt.subplot(1, 2, 1)
sns.barplot(x='Metric', y='Value', data=combined_metrics,
palette='Paired')
plt.title('Campaign Control vs Campaign Test - CTR')
plt.ylabel('Click-Through Rate (%)')
plt.xlabel('Campaign')

plt.subplot(1, 2, 2)
sns.barplot(x='Metric', y='Value', data=combined_metrics2,
palette='Paired')
plt.title('Campaign Control vs Campaign Test - CR')
plt.ylabel('Conversion Rate (%)')
plt.xlabel('Campaign')

plt.tight_layout()
plt.show()

```



The sum of CTRs of Campaign Test is greater than Campaign Control, it suggests that individual CTRs for Campaign Test are higher than those for Campaign Control.

However, the sum of CR (Conversion Rate) for Campaign Control is higher, it indicates that, despite having a lower CTR, the users from Campaign Control are converting at a higher rate (i.e., completing desired actions like purchases).

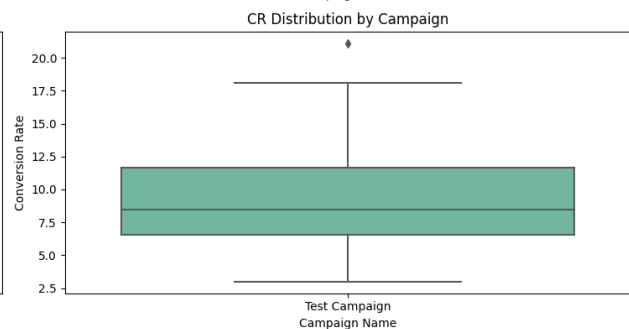
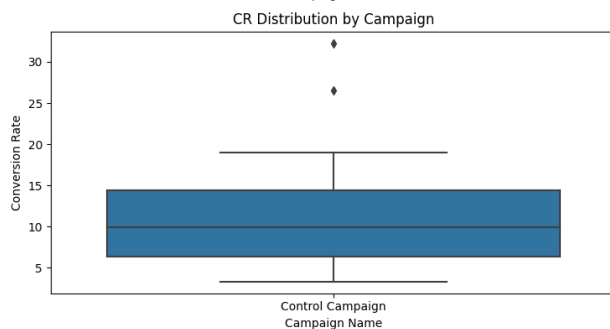
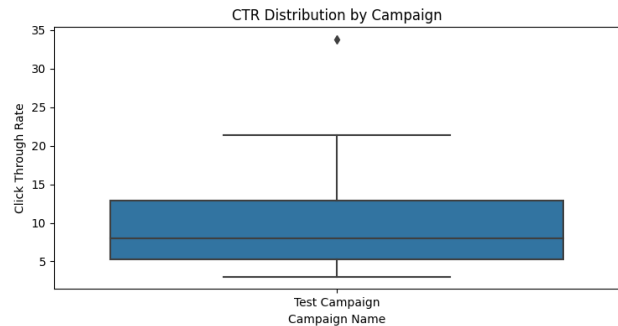
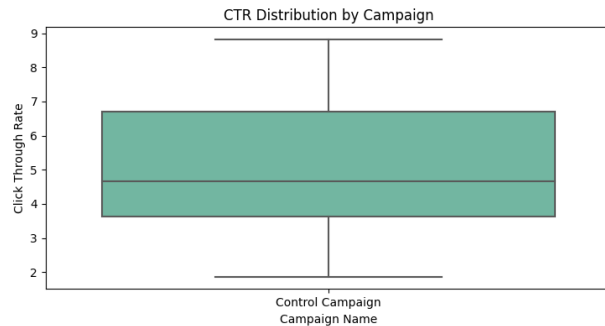
**High CTR but low CR:** This may suggest that while Campaign Test attracts more users (due to high CTR), they are not converting as effectively.

**Lower CTR but high CR:** This suggests that Campaign Control might attract fewer users, but the users they attract are more likely to convert.

```
plt.figure(figsize=(15,8))
plt.subplot(2,2,1)
sns.boxplot(x='Campaign Name',y='Click Through
Rate',data=control_df,hue='Campaign Name',dodge=False,palette="Set2")
plt.title('CTR Distribution by Campaign')
plt.legend([], [], frameon=False)
plt.subplot(2,2,2)
sns.boxplot(x='Campaign Name',y='Click Through
Rate',data=test_df,hue='Campaign Name',dodge=False)
plt.title('CTR Distribution by Campaign')
plt.legend([], [], frameon=False)

plt.subplot(2,2,3)
sns.boxplot(x='Campaign Name',y='Conversion
Rate',data=control_df,hue='Campaign Name',dodge=False)
plt.title('CR Distribution by Campaign')
plt.legend([], [], frameon=False)
plt.subplot(2,2,4)
```

```
sns.boxplot(x='Campaign Name',y='Conversion
Rate',data=test_df,hue='Campaign Name',dodge=False,palette="Set2")
plt.title('CR Distribution by Campaign')
plt.legend([], [], frameon=False)
plt.tight_layout()
plt.show()
```



```
#View to Cart Conversion Rate- Control
VCR_C=round((100*control_df['Added to Cart']/control_df['Content
Viewed']).mean(),2)
```

```
#View to Cart Conversion Rate- Test
VCR_T=round((100*test_df['Added to Cart']/test_df['Content
Viewed']).mean(),2)
```

```
print(VCR_C,VCR_T)
```

```
77.44 51.51
```

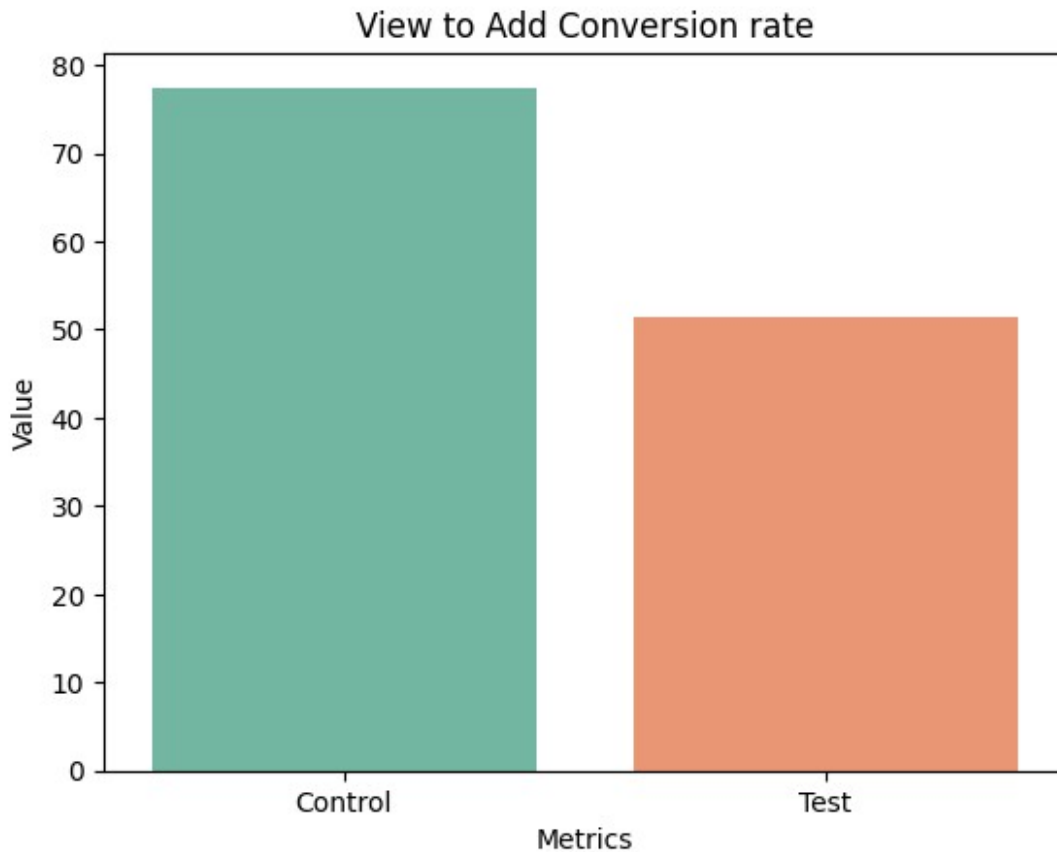
```
df1= pd.DataFrame({'Metrics':['Control'],
                    'Value':[VCR_C]})
```

```
df2=pd.DataFrame({'Metrics':['Test'],
                  'Value':[VCR_T]})
```

```
combined_metrics2=pd.concat([df1,df2],ignore_index= True)
combined_metrics2
```

|   | Metrics | Value |
|---|---------|-------|
| 0 | Control | 77.44 |
| 1 | Test    | 51.51 |

```
sns.barplot(x='Metrics',y="Value",data=combined_metrics2,palette="Set2")
plt.title("View to Add Conversion rate")
plt.show()
```



From this visualization we can interpret, the control campaign demonstrates a higher View-to-Card Conversion Rate compared to the test campaign. This indicates that users exposed to the control campaign are more likely to add products to their cart after viewing the ad.

```
merged_df=pd.concat([control_df,test_df],ignore_index=True)
merged_df
```

|   | Campaign Name    | Date       | Amount Spent | Number of Impressions |
|---|------------------|------------|--------------|-----------------------|
| 0 | Control Campaign | 2019-08-01 | 2280         | 82702                 |
| 1 | Control Campaign | 2019-08-02 | 1757         | 121040                |
| 2 | Control Campaign | 2019-08-03 | 2343         | 131711                |
| 3 | Control Campaign | 2019-08-04 | 1940         | 72878                 |

|        |                             |      |        |
|--------|-----------------------------|------|--------|
| 4      | Control Campaign 2019-08-05 | 1835 | 113430 |
| 91579  |                             |      |        |
| 5      | Control Campaign 2019-08-06 | 3083 | 109076 |
| 87998  |                             |      |        |
| 6      | Control Campaign 2019-08-07 | 2544 | 142123 |
| 127852 |                             |      |        |
| 7      | Control Campaign 2019-08-08 | 1900 | 90939  |
| 65217  |                             |      |        |
| 8      | Control Campaign 2019-08-09 | 2813 | 121332 |
| 94896  |                             |      |        |
| 9      | Control Campaign 2019-08-10 | 2149 | 117624 |
| 91257  |                             |      |        |
| 10     | Control Campaign 2019-08-11 | 2490 | 115247 |
| 95843  |                             |      |        |
| 11     | Control Campaign 2019-08-12 | 2319 | 116639 |
| 100189 |                             |      |        |
| 12     | Control Campaign 2019-08-13 | 2697 | 82847  |
| 68214  |                             |      |        |
| 13     | Control Campaign 2019-08-14 | 1875 | 145248 |
| 118632 |                             |      |        |
| 14     | Control Campaign 2019-08-15 | 2774 | 132845 |
| 102479 |                             |      |        |
| 15     | Control Campaign 2019-08-16 | 2024 | 71274  |
| 42859  |                             |      |        |
| 16     | Control Campaign 2019-08-17 | 2177 | 119612 |
| 106518 |                             |      |        |
| 17     | Control Campaign 2019-08-18 | 1876 | 108452 |
| 96518  |                             |      |        |
| 18     | Control Campaign 2019-08-19 | 2596 | 107890 |
| 81268  |                             |      |        |
| 19     | Control Campaign 2019-08-20 | 2675 | 113430 |
| 78625  |                             |      |        |
| 20     | Control Campaign 2019-08-21 | 1803 | 74654  |
| 59873  |                             |      |        |
| 21     | Control Campaign 2019-08-22 | 2939 | 105705 |
| 86218  |                             |      |        |
| 22     | Control Campaign 2019-08-23 | 2496 | 129880 |
| 109413 |                             |      |        |
| 23     | Control Campaign 2019-08-24 | 1892 | 72515  |
| 51987  |                             |      |        |
| 24     | Control Campaign 2019-08-25 | 1962 | 117006 |
| 100398 |                             |      |        |
| 25     | Control Campaign 2019-08-26 | 2233 | 124897 |
| 98432  |                             |      |        |
| 26     | Control Campaign 2019-08-27 | 2061 | 104678 |
| 91579  |                             |      |        |
| 27     | Control Campaign 2019-08-28 | 2421 | 141654 |
| 125874 |                             |      |        |
| 28     | Control Campaign 2019-08-29 | 2375 | 92029  |

|        |                  |            |      |  |        |
|--------|------------------|------------|------|--|--------|
| 74192  |                  |            |      |  |        |
| 29     | Control Campaign | 2019-08-30 | 2324 |  | 111306 |
| 88632  |                  |            |      |  |        |
| 30     | Test Campaign    | 2019-08-01 | 3008 |  | 39550  |
| 35820  |                  |            |      |  |        |
| 31     | Test Campaign    | 2019-08-02 | 2542 |  | 100719 |
| 91236  |                  |            |      |  |        |
| 32     | Test Campaign    | 2019-08-03 | 2365 |  | 70263  |
| 45198  |                  |            |      |  |        |
| 33     | Test Campaign    | 2019-08-04 | 2710 |  | 78451  |
| 25937  |                  |            |      |  |        |
| 34     | Test Campaign    | 2019-08-05 | 2297 |  | 114295 |
| 95138  |                  |            |      |  |        |
| 35     | Test Campaign    | 2019-08-06 | 2458 |  | 42684  |
| 31489  |                  |            |      |  |        |
| 36     | Test Campaign    | 2019-08-07 | 2838 |  | 53986  |
| 42148  |                  |            |      |  |        |
| 37     | Test Campaign    | 2019-08-08 | 2916 |  | 33669  |
| 20149  |                  |            |      |  |        |
| 38     | Test Campaign    | 2019-08-09 | 2652 |  | 45511  |
| 31598  |                  |            |      |  |        |
| 39     | Test Campaign    | 2019-08-10 | 2790 |  | 95054  |
| 79632  |                  |            |      |  |        |
| 40     | Test Campaign    | 2019-08-11 | 2420 |  | 83633  |
| 71286  |                  |            |      |  |        |
| 41     | Test Campaign    | 2019-08-12 | 2831 |  | 124591 |
| 10598  |                  |            |      |  |        |
| 42     | Test Campaign    | 2019-08-13 | 1972 |  | 65827  |
| 49531  |                  |            |      |  |        |
| 43     | Test Campaign    | 2019-08-14 | 2537 |  | 56304  |
| 25982  |                  |            |      |  |        |
| 44     | Test Campaign    | 2019-08-15 | 2516 |  | 94338  |
| 76219  |                  |            |      |  |        |
| 45     | Test Campaign    | 2019-08-16 | 3076 |  | 106584 |
| 81389  |                  |            |      |  |        |
| 46     | Test Campaign    | 2019-08-17 | 1968 |  | 95843  |
| 54389  |                  |            |      |  |        |
| 47     | Test Campaign    | 2019-08-18 | 1979 |  | 53632  |
| 43241  |                  |            |      |  |        |
| 48     | Test Campaign    | 2019-08-19 | 2626 |  | 22521  |
| 10698  |                  |            |      |  |        |
| 49     | Test Campaign    | 2019-08-20 | 2712 |  | 39470  |
| 31893  |                  |            |      |  |        |
| 50     | Test Campaign    | 2019-08-21 | 3112 |  | 133771 |
| 109834 |                  |            |      |  |        |
| 51     | Test Campaign    | 2019-08-22 | 2899 |  | 34752  |
| 27932  |                  |            |      |  |        |
| 52     | Test Campaign    | 2019-08-23 | 2407 |  | 60286  |
| 49329  |                  |            |      |  |        |



|              |                          |      |        |
|--------------|--------------------------|------|--------|
| 53<br>30489  | Test Campaign 2019-08-24 | 2078 | 36650  |
| 54<br>105978 | Test Campaign 2019-08-25 | 2928 | 120576 |
| 55<br>61589  | Test Campaign 2019-08-26 | 2311 | 80841  |
| 56<br>92159  | Test Campaign 2019-08-27 | 2915 | 111469 |
| 57<br>41267  | Test Campaign 2019-08-28 | 2247 | 54627  |
| 58<br>43219  | Test Campaign 2019-08-29 | 2805 | 67444  |
| 59<br>89380  | Test Campaign 2019-08-30 | 1977 | 120203 |

| Cart \ | Website Clicks | Searches Received | Content Viewed | Added to |
|--------|----------------|-------------------|----------------|----------|
| 0      | 7016           | 2290              | 2159           | 1819     |
| 1      | 8110           | 2033              | 1841           | 1219     |
| 2      | 6508           | 1737              | 1549           | 1134     |
| 3      | 3065           | 1042              | 982            | 1183     |
| 4      | 5224           | 2390              | 1984           | 1339     |
| 5      | 4028           | 1709              | 1249           | 784      |
| 6      | 2640           | 1388              | 1106           | 1166     |
| 7      | 7260           | 3047              | 2746           | 930      |
| 8      | 6198           | 2487              | 2179           | 645      |
| 9      | 2277           | 2475              | 1984           | 1629     |
| 10     | 8137           | 2941              | 2486           | 1887     |
| 11     | 2993           | 1397              | 1147           | 1439     |
| 12     | 6554           | 2390              | 1975           | 1794     |
| 13     | 4521           | 1209              | 1149           | 1339     |
| 14     | 4896           | 1179              | 1005           | 1641     |
| 15     | 5224           | 2427              | 2158           | 1613     |
| 16     | 6628           | 1756              | 1642           | 878      |

|    |      |      |      |      |
|----|------|------|------|------|
| 17 | 7253 | 2447 | 2115 | 1695 |
| 18 | 3706 | 2483 | 2098 | 908  |
| 19 | 2578 | 1001 | 848  | 1709 |
| 20 | 5691 | 2711 | 2496 | 1460 |
| 21 | 6843 | 3102 | 2988 | 819  |
| 22 | 4410 | 2896 | 2496 | 1913 |
| 23 | 4085 | 1274 | 1149 | 1146 |
| 24 | 4234 | 2423 | 2096 | 883  |
| 25 | 5435 | 2847 | 2421 | 1448 |
| 26 | 4941 | 3549 | 3249 | 980  |
| 27 | 6287 | 1672 | 1589 | 1711 |
| 28 | 8127 | 4891 | 4219 | 1486 |
| 29 | 4658 | 1615 | 1249 | 442  |
| 30 | 3038 | 1946 | 1069 | 894  |
| 31 | 4657 | 2359 | 1548 | 879  |
| 32 | 7885 | 2572 | 2367 | 1268 |
| 33 | 4216 | 2216 | 1437 | 566  |
| 34 | 5863 | 2106 | 858  | 956  |
| 35 | 7488 | 1854 | 1073 | 882  |
| 36 | 4221 | 2733 | 2182 | 1301 |
| 37 | 7184 | 2867 | 2194 | 1240 |
| 38 | 8259 | 2899 | 2761 | 1200 |
| 39 | 8125 | 2312 | 1804 | 424  |
| 40 | 3750 | 2893 | 2617 | 1075 |
| 41 | 8264 | 2081 | 1992 | 1382 |
| 42 | 7568 | 2213 | 2058 | 1391 |

|    |      |      |      |      |
|----|------|------|------|------|
| 43 | 3993 | 1979 | 1059 | 779  |
| 44 | 4993 | 2537 | 1609 | 1090 |
| 45 | 6800 | 2661 | 2594 | 1059 |
| 46 | 7910 | 1995 | 1576 | 383  |
| 47 | 6909 | 2824 | 2522 | 461  |
| 48 | 7617 | 2924 | 2801 | 788  |
| 49 | 6050 | 2061 | 1894 | 1047 |
| 50 | 5471 | 1995 | 1868 | 278  |
| 51 | 4431 | 1983 | 1131 | 367  |
| 52 | 5077 | 2592 | 2004 | 632  |
| 53 | 7156 | 2687 | 2427 | 327  |
| 54 | 3596 | 2937 | 2551 | 1228 |
| 55 | 3820 | 2037 | 1046 | 346  |
| 56 | 6435 | 2976 | 2552 | 992  |
| 57 | 8144 | 2432 | 1281 | 1009 |
| 58 | 7651 | 1920 | 1240 | 1168 |
| 59 | 4399 | 2978 | 1625 | 1034 |

|    | Purchases | Click Through | Rate | Conversion | Rate  | CPC  |
|----|-----------|---------------|------|------------|-------|------|
| 0  | 618       |               | 8.48 |            | 8.81  | 0.32 |
| 1  | 511       |               | 6.70 |            | 6.30  | 0.22 |
| 2  | 372       |               | 4.94 |            | 5.72  | 0.36 |
| 3  | 340       |               | 4.21 |            | 11.09 | 0.63 |
| 4  | 501       |               | 4.61 |            | 9.59  | 0.35 |
| 5  | 764       |               | 3.69 |            | 18.97 | 0.77 |
| 6  | 499       |               | 1.86 |            | 18.90 | 0.96 |
| 7  | 462       |               | 7.98 |            | 6.36  | 0.26 |
| 8  | 501       |               | 5.11 |            | 8.08  | 0.45 |
| 9  | 734       |               | 1.94 |            | 32.24 | 0.94 |
| 10 | 475       |               | 7.06 |            | 5.84  | 0.31 |
| 11 | 794       |               | 2.57 |            | 26.53 | 0.77 |
| 12 | 766       |               | 7.91 |            | 11.69 | 0.41 |
| 13 | 788       |               | 3.11 |            | 17.43 | 0.41 |
| 14 | 366       |               | 3.69 |            | 7.48  | 0.57 |

|    |     |       |       |      |
|----|-----|-------|-------|------|
| 15 | 438 | 7.33  | 8.38  | 0.39 |
| 16 | 222 | 5.54  | 3.35  | 0.33 |
| 17 | 243 | 6.69  | 3.35  | 0.26 |
| 18 | 542 | 3.43  | 14.62 | 0.70 |
| 19 | 299 | 2.27  | 11.60 | 1.04 |
| 20 | 800 | 7.62  | 14.06 | 0.32 |
| 21 | 387 | 6.47  | 5.66  | 0.43 |
| 22 | 766 | 3.40  | 17.37 | 0.57 |
| 23 | 585 | 5.63  | 14.32 | 0.46 |
| 24 | 386 | 3.62  | 9.12  | 0.46 |
| 25 | 251 | 4.35  | 4.62  | 0.41 |
| 26 | 605 | 4.72  | 12.24 | 0.42 |
| 27 | 643 | 4.44  | 10.23 | 0.39 |
| 28 | 334 | 8.83  | 4.11  | 0.29 |
| 29 | 670 | 4.18  | 14.38 | 0.50 |
| 30 | 255 | 7.68  | 8.39  | 0.99 |
| 31 | 677 | 4.62  | 14.54 | 0.55 |
| 32 | 578 | 11.22 | 7.33  | 0.30 |
| 33 | 340 | 5.37  | 8.06  | 0.64 |
| 34 | 768 | 5.13  | 13.10 | 0.39 |
| 35 | 488 | 17.54 | 6.52  | 0.33 |
| 36 | 890 | 7.82  | 21.09 | 0.67 |
| 37 | 431 | 21.34 | 6.00  | 0.41 |
| 38 | 845 | 18.15 | 10.23 | 0.32 |
| 39 | 275 | 8.55  | 3.38  | 0.34 |
| 40 | 668 | 4.48  | 17.81 | 0.65 |
| 41 | 709 | 6.63  | 8.58  | 0.34 |
| 42 | 812 | 11.50 | 10.73 | 0.26 |
| 43 | 340 | 7.09  | 8.51  | 0.64 |
| 44 | 398 | 5.29  | 7.97  | 0.50 |
| 45 | 487 | 6.38  | 7.16  | 0.45 |
| 46 | 238 | 8.25  | 3.01  | 0.25 |
| 47 | 257 | 12.88 | 3.72  | 0.29 |
| 48 | 512 | 33.82 | 6.72  | 0.34 |
| 49 | 730 | 15.33 | 12.07 | 0.45 |
| 50 | 245 | 4.09  | 4.48  | 0.57 |
| 51 | 276 | 12.75 | 6.23  | 0.65 |
| 52 | 473 | 8.42  | 9.32  | 0.47 |
| 53 | 269 | 19.53 | 3.76  | 0.29 |
| 54 | 651 | 2.98  | 18.10 | 0.81 |
| 55 | 284 | 4.73  | 7.43  | 0.60 |
| 56 | 771 | 5.77  | 11.98 | 0.45 |
| 57 | 721 | 14.91 | 8.85  | 0.28 |
| 58 | 677 | 11.34 | 8.85  | 0.37 |
| 59 | 572 | 3.66  | 13.00 | 0.45 |

```
merged_df.columns = merged_df.columns.str.strip() # Removes
leading/trailing spaces
print(merged_df.columns) # Verify column names again
```

```
Index(['Campaign Name', 'Date', 'Amount Spent', 'Number of  
Impressions',  
      'Reach', 'Website Clicks', 'Searches Received', 'Content  
Viewed',  
      'Added to Cart', 'Purchases', 'Click Through Rate', 'Conversion  
Rate',  
      'CPC'],  
      dtype='object')
```

```
plt.figure(figsize=(15, 6))
```

```
# Control Campaign
```

```
plt.subplot(1, 2, 1)
```

```
sns.scatterplot(  
    data=control_df,  
    x="Added to Cart",  
    y="Purchases",  
    hue="Campaign Name",  
    palette="viridis",  
    s=100,  
)
```

```
sns.regplot(  
    data=control_df,  
    x="Added to Cart",  
    y="Purchases",  
    scatter=False,  
    color="red",  
    line_kws={"linewidth": 2},  
)
```

```
plt.title("Control Campaign: Purchases vs. Added to Cart")
```

```
plt.legend(bbox_to_anchor=(1.05, 1), loc="upper left",  
borderaxespad=0)
```

```
# Test Campaign
```

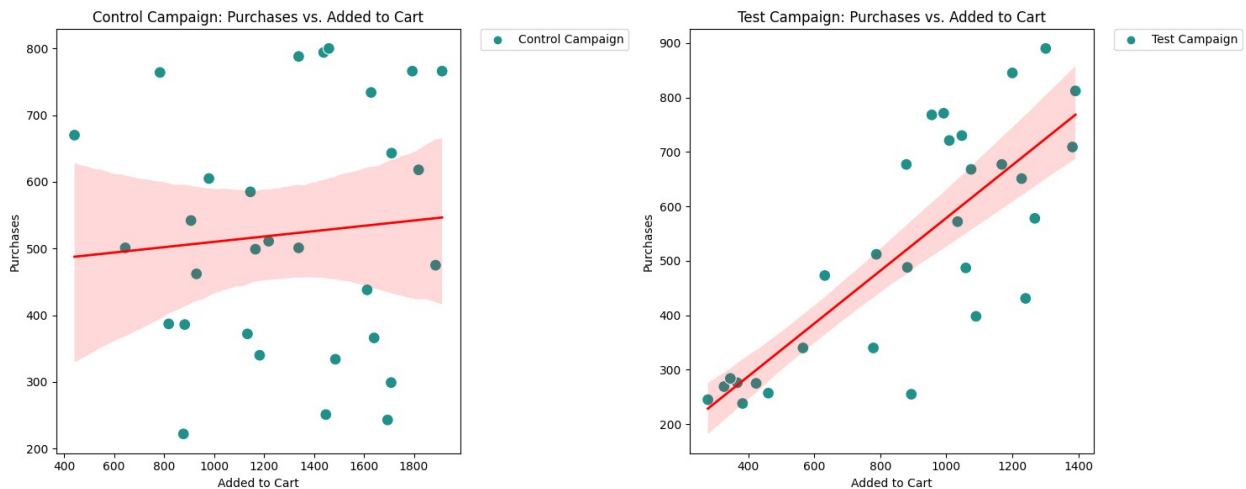
```
plt.subplot(1, 2, 2)
```

```
sns.scatterplot(  
    data=test_df,  
    x="Added to Cart",  
    y="Purchases",  
    hue="Campaign Name",  
    palette="viridis",  
    s=100,  
)
```

```
sns.regplot(  
    data=test_df,  
    x="Added to Cart",  
    y="Purchases",  
    scatter=False,  
    color="red",  
    line_kws={"linewidth": 2},
```

```
)
plt.title("Test Campaign: Purchases vs. Added to Cart")
plt.legend(bbox_to_anchor=(1.05, 1), loc="upper left",
borderaxespad=0)

plt.tight_layout()
plt.show()
```



```
# Calculate CPC for each campaign
control_df['CPC'] = round(control_df['Amount Spent'] /
control_df['Website Clicks'], 2)
test_df['CPC'] = round(test_df['Amount Spent'] / test_df['Website
Clicks'], 2)

df3 = pd.DataFrame({'Metrics': ["Control"] * len(control_df), 'Value':
control_df['CPC']})
df4 = pd.DataFrame({'Metrics': ["Test"] * len(test_df), 'Value':
test_df['CPC']})

combined_metrics3 = pd.concat([df3, df4], ignore_index=True)

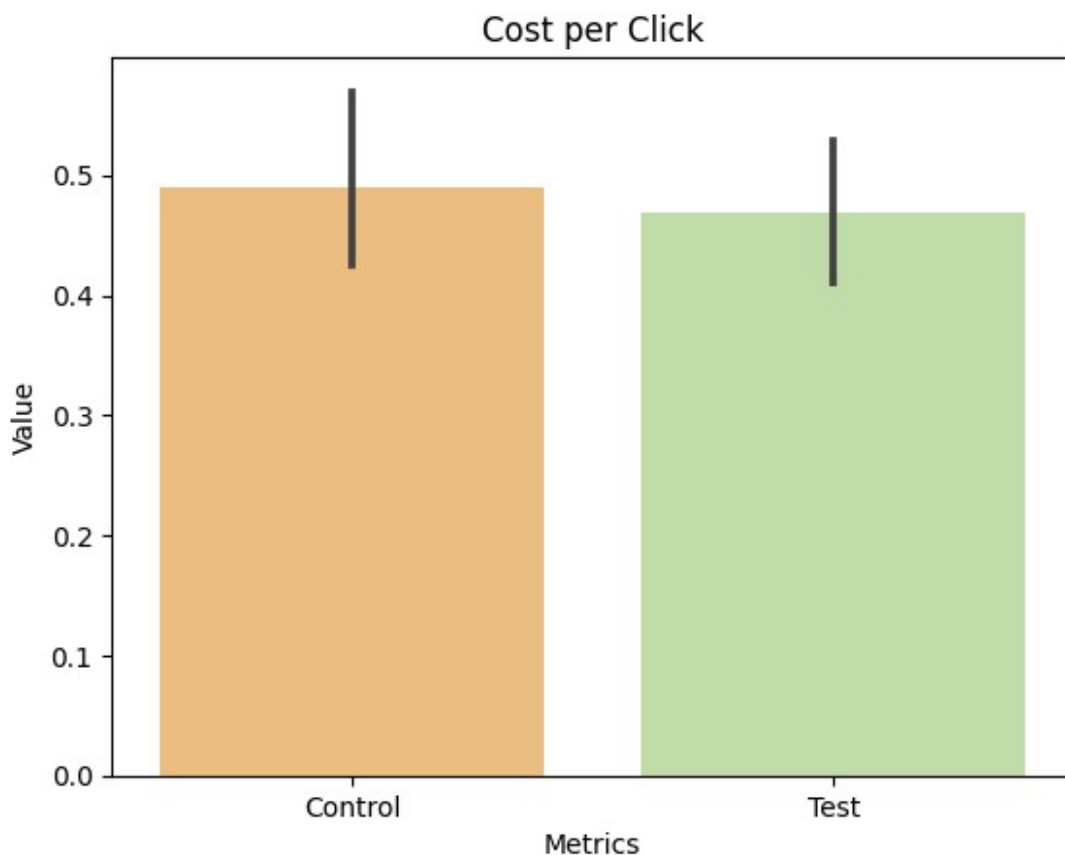
print(combined_metrics3)
```

|   | Metrics | Value |
|---|---------|-------|
| 0 | Control | 0.32  |
| 1 | Control | 0.22  |
| 2 | Control | 0.36  |
| 3 | Control | 0.63  |
| 4 | Control | 0.35  |
| 5 | Control | 0.77  |
| 6 | Control | 0.96  |
| 7 | Control | 0.26  |
| 8 | Control | 0.45  |
| 9 | Control | 0.94  |

|    |         |      |
|----|---------|------|
| 10 | Control | 0.31 |
| 11 | Control | 0.77 |
| 12 | Control | 0.41 |
| 13 | Control | 0.41 |
| 14 | Control | 0.57 |
| 15 | Control | 0.39 |
| 16 | Control | 0.33 |
| 17 | Control | 0.26 |
| 18 | Control | 0.70 |
| 19 | Control | 1.04 |
| 20 | Control | 0.32 |
| 21 | Control | 0.43 |
| 22 | Control | 0.57 |
| 23 | Control | 0.46 |
| 24 | Control | 0.46 |
| 25 | Control | 0.41 |
| 26 | Control | 0.42 |
| 27 | Control | 0.39 |
| 28 | Control | 0.29 |
| 29 | Control | 0.50 |
| 30 | Test    | 0.99 |
| 31 | Test    | 0.55 |
| 32 | Test    | 0.30 |
| 33 | Test    | 0.64 |
| 34 | Test    | 0.39 |
| 35 | Test    | 0.33 |
| 36 | Test    | 0.67 |
| 37 | Test    | 0.41 |
| 38 | Test    | 0.32 |
| 39 | Test    | 0.34 |
| 40 | Test    | 0.65 |
| 41 | Test    | 0.34 |
| 42 | Test    | 0.26 |
| 43 | Test    | 0.64 |
| 44 | Test    | 0.50 |
| 45 | Test    | 0.45 |
| 46 | Test    | 0.25 |
| 47 | Test    | 0.29 |
| 48 | Test    | 0.34 |
| 49 | Test    | 0.45 |
| 50 | Test    | 0.57 |
| 51 | Test    | 0.65 |
| 52 | Test    | 0.47 |
| 53 | Test    | 0.29 |
| 54 | Test    | 0.81 |
| 55 | Test    | 0.60 |
| 56 | Test    | 0.45 |
| 57 | Test    | 0.28 |

```
58     Test    0.37
59     Test    0.45
```

```
sns.barplot(x='Metrics',y="Value",data=combined_metrics3,palette="Spectral")
plt.title("Cost per Click")
plt.show()
```



From above chart we can observe that the Control campaign CPC is slightly higher than the Test campaign CPC. This indicates the control campaign might be spending more amount per click or might be having fewer clicks when compared to test campaign.

### Hypothesis Testing

Hypothesis: Performing Control campaign result in higher number of ad conversions compared to performing Test Campaign

H0: There is no difference in number of conversions between Control campaign and test Campaign

H1: There is a difference in number of conversions between Control campaign and test Campaign

```
CR_C= round(Total1.mean(),2)
CR_T= round(Total2.mean(),2)
```



```

CTR_C=round(sum1.mean(),2)
CTR_T=round(sum2.mean(),2)

print("Mean Conversion Rate_____")
print("Conversion Rate For Control:", CR_C)
print("Conversion Rate For Test:",CR_T)
ttest,p_value=stats.ttest_ind(a=control_df['Conversion
Rate'],b=test_df['Conversion Rate'],equal_var=False)
print(ttest)
print(p_value)
if p_value<0.05:
    print("We are rejecting the Null Hypothesis")
else:
    print('We are failed to reject the Null Hypothesis')

Mean Conversion Rate_____
Conversion Rate For Control: 11.41
Conversion Rate For Test: 9.23
1.4829705689156862
0.14432230844288618
We are failed to reject the Null Hypothesis

```

The mean conversion rate of Control campaign is more or less similar to the mean conversion rate of test campaign. This suggests, on average, both the campaigns are having similar conversion rate.

Hypothesis: Performing Control campaign result in higher number of ad conversions compared to performing Test Campaign

H0: There is no difference in Click Through Rate between Cotrol campaign and test Campaign

H1: There is a difference in Click Through Rate between Cotrol campaign and test Campaign

```

print("Mean Click Through Rate_____")
print("Conversion Rate For Control:",CTR_C)
print("Conversion Rate For Test:",CTR_T)
ttest,p_value=stats.ttest_ind(a=control_df['Click Through
Rate'],b=test_df['Click Through Rate'],equal_var=False)
print(ttest)
print(p_value)
if p_value<0.05:
    print("We are rejecting the Null Hypothesis")
else:
    print('We are failed to reject the Null Hypothesis')

Mean Click Through Rate_____
Conversion Rate For Control: 5.08
Conversion Rate For Test: 10.24
-4.001968004017592

```

0.00032079103247097454

We are rejecting the Null Hypothesis

Here, we can observe that the  $T_{\text{test}}$  value is in negative which explains control campaign CTR is lesser than test campaign CTR.

The mean click through rate of test campaign(10.24) is higher than the mean click through rate of control campaign(5.08). This indicates the test campaign attracts more number of clicks compared to the control campaign.