

q3

March 6, 2022

## 1 Question 3: Outlier Detection (10 points)

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```
[1]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

```
[21]: # read data
df = pd.read_csv("prog_book.csv", thousands=',')
display(df)
```

|     | Rating | Reviews | Book_title \                                      |
|-----|--------|---------|---|
| 0   | 4.17   | 3829    | The Elements of Style                             |
| 1   | 4.01   | 1406    | The Information: A History, a Theory, a Flood     |
| 2   | 3.33   | 0       | Responsive Web Design Overview For Beginners      |
| 3   | 3.97   | 1658    | Ghost in the Wires: My Adventures as the World... |
| 4   | 4.06   | 1325    | How Google Works                                  |
| ..  | ...    | ...     | ...   |
| 266 | 3.76   | 0       | 3D Game Engine Architecture: Engineering Real...  |
| 267 | 3.94   | 22      | An Introduction to Database Systems               |
| 268 | 4.49   | 36      | The Art of Computer Programming, Volumes 1-3 B... |
| 269 | 4.77   | 4       | The Art of Computer Programming, Volumes 1-4a ... |
| 270 | 3.84   | 5       | A Discipline for Software Engineering             |

|     | Description                                       | Number_Of_Pages \ |
|-----|---|-------------------|
| 0   | This style manual offers practical advice on i... | 105               |
| 1   | James Gleick, the author of the best sellers C... | 527               |
| 2   | In Responsive Web Design Overview For Beginner... | 50                |
| 3   | If they were a hall of fame or shame for compu... | 393               |
| 4   | Both Eric Schmidt and Jonathan Rosenberg came ... | 305               |
| ..  | ...   | ...               |
| 266 | Dave Eberly's 3D Game Engine Design was the fi... | 752               |
| 267 | Continuing in the eighth edition, An Introduct... | 1040              |
| 268 | Knuth's classic work has been widely acclaimed... | 896               |
| 269 | "The bible of all fundamental algorithms and t... | 3168              |
| 270 | Designed to help individual programmers develo... | 789               |

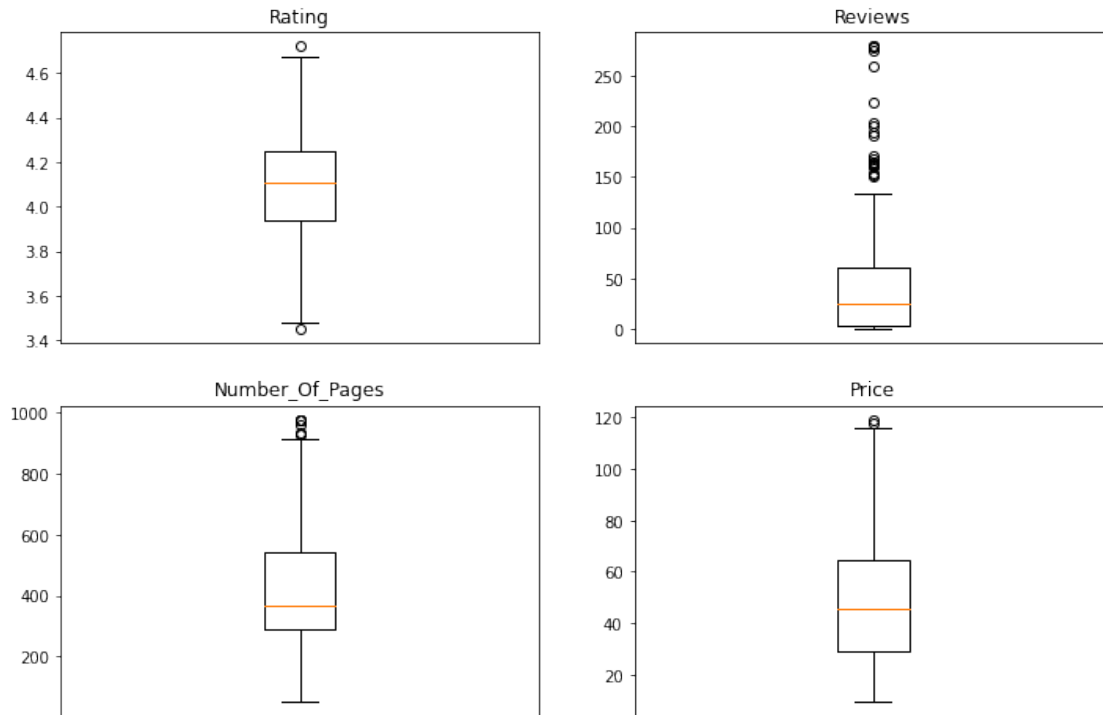
|     | Type                  | Price      |
|-----|-----------------------|------------|
| 0   | Hardcover             | 9.323529   |
| 1   | Hardcover             | 11.000000  |
| 2   | Kindle Edition        | 11.267647  |
| 3   | Hardcover             | 12.873529  |
| 4   | Kindle Edition        | 13.164706  |
| ..  | ...                   | ...        |
| 266 | Hardcover             | 203.108823 |
| 267 | Paperback             | 212.097059 |
| 268 | Boxed Set - Hardcover | 220.385294 |
| 269 | Hardcover             | 220.385294 |
| 270 | Hardcover             | 235.650000 |

[271 rows x 7 columns]

## 1.1 Task 1: Univariate Outlier detection (4 points)

```
[22]: detection_rows = ["Rating", "Reviews", "Number_Of_Pages", "Price"]
def outlier_detection(df, name):
    data = df[[name]].to_numpy()
    # finding the 1st quartile
    q1 = np.quantile(data, 0.25)
    # finding the 3rd quartile
    q3 = np.quantile(data, 0.75)
    med = np.median(data)
    # finding the iqr region
    iqr = q3 - q1
    # finding upper and lower whiskers
    upper_bound = q3 + (1.5 * iqr)
    lower_bound = q1 - (1.5 * iqr)
    # print(iqr, upper_bound, lower_bound)
    # boxplot of data within the whisker
    data = data[(data >= lower_bound) & (data <= upper_bound)]
    plt.boxplot(data)
    plt.xticks([])
    plt.title(name)

plt.figure(figsize = (12,8))
i = 1
for name in detection_rows:
    plt.subplot(2,2,i)
    i += 1
    outlier_detection(df, name)
# plt.show()
```



## 1.2 Task 2: Multivariate Outlier detection (6 points)

### 1.2.1 bivariate analysis on all possible pairs of the above features and identify any outliers

features = ["Rating", "Reviews", "Number\_Of\_Pages", "Price", "Type\_category"]

```
[118]: from sklearn.cluster import DBSCAN
from sklearn.preprocessing import MinMaxScaler, RobustScaler

df["Type_category"] = df["Type"].astype('category').cat.codes
features = ["Rating", "Reviews", "Number_Of_Pages", "Price", "Type_category"]
i = 1
j = 0
plt.figure(figsize=(25,16))

outliers = {}

for feature1 in features:
    for feature2 in features:
        if feature1 == feature2:
            continue
        plt.subplot(5,4,i)
        i += 1
```

```

combined_feature = df[[feature1, feature2]].to_numpy()
scaled_features = combined_feature.copy()
# scale to 0,1
scaler1 = MinMaxScaler()
scaler1.fit(scaled_features[:,0].reshape(-1, 1))
scaled_features[:,0] = scaler1.transform(scaled_features[:,0]).
↳reshape(-1, 1)).reshape(-1)

scaler2 = MinMaxScaler()
scaler2.fit(scaled_features[:,1].reshape(-1, 1))
scaled_features[:,1] = scaler2.transform(scaled_features[:,1]).
↳reshape(-1, 1)).reshape(-1)

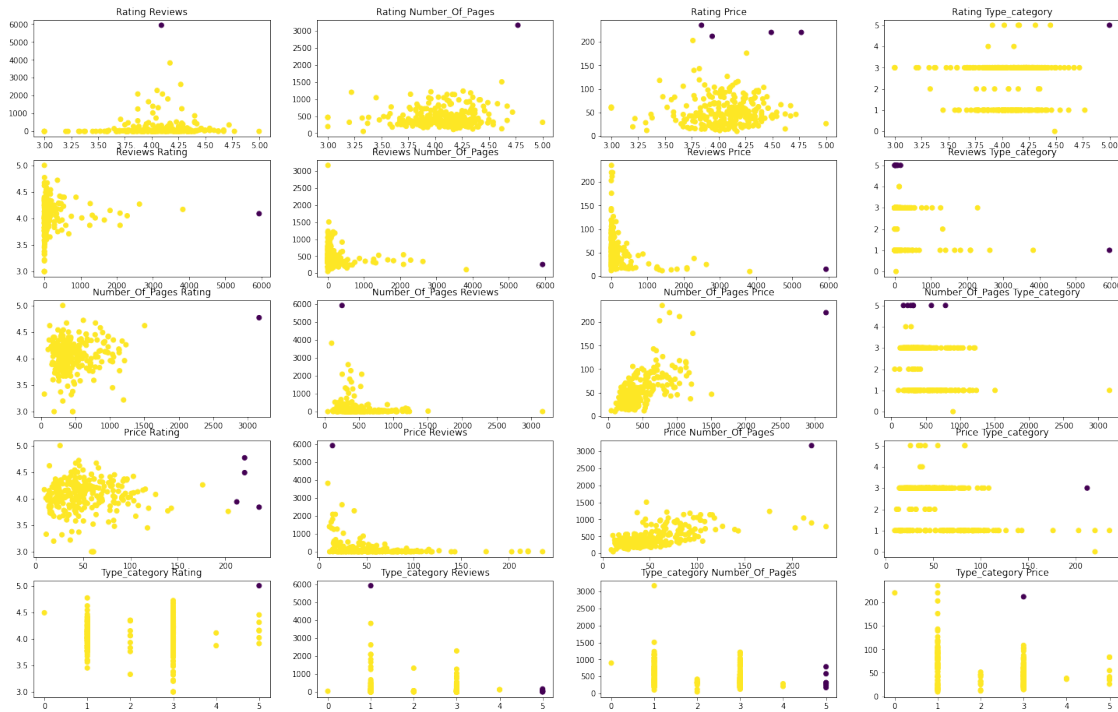
clustering = DBSCAN(eps=0.3, min_samples=10).fit(scaled_features)
labels = clustering.labels_

title = feature1 + " " + feature2
indexs = np.array(np.where(labels < 0)).reshape(-1)
out = np.array(combined_feature[indexs])
out = pd.DataFrame(data = out, index = indexs, columns = [feature1,
↳feature2])
outliers[title] = out

plt.title(title)
plt.scatter(combined_feature[:,0], combined_feature[:,1], c = labels)

plt.show()

```



```
[119]: # print the index and value of outliers
```

```
print("Outlier indexs and values")
for title, outlier in outliers.items():
    print(title + " : ")
    display(outlier)
```

Outlier indexs and values

Rating Reviews :

|   | Rating | Reviews |
|---|--------|---------|
| 6 | 4.09   | 5938.0  |

Rating Number\_Of\_Pages :

|     | Rating | Number_Of_Pages |
|-----|--------|-----------------|
| 269 | 4.77   | 3168.0          |

Rating Price :

|     | Rating | Price      |
|-----|--------|------------|
| 267 | 3.94   | 212.097059 |
| 268 | 4.49   | 220.385294 |
| 269 | 4.77   | 220.385294 |
| 270 | 3.84   | 235.650000 |

Rating Type\_category :

|    | Rating | Type_category |
|----|--------|---------------|
| 54 | 5.0    | 5.0           |

Reviews Rating :

|   | Reviews | Rating |
|---|---------|--------|
| 6 | 5938.0  | 4.09   |

Reviews Number\_Of\_Pages :

|   | Reviews | Number_Of_Pages |
|---|---------|-----------------|
| 6 | 5938    | 256             |

Reviews Price :

|   | Reviews | Price     |
|---|---------|-----------|
| 6 | 5938.0  | 14.232353 |

Reviews Type\_category :

|     | Reviews | Type_category |
|-----|---------|---------------|
| 6   | 5938    | 1             |
| 54  | 0       | 5             |
| 78  | 33      | 5             |
| 88  | 161     | 5             |
| 107 | 18      | 5             |
| 166 | 57      | 5             |
| 228 | 88      | 5             |
| 229 | 3       | 5             |

Number\_Of\_Pages Rating :

|     | Number_Of_Pages | Rating |
|-----|-----------------|--------|
| 269 | 3168.0          | 4.77   |

Number\_Of\_Pages Reviews :

|   | Number_Of_Pages | Reviews |
|---|-----------------|---------|
| 6 | 256             | 5938    |

Number\_Of\_Pages Price :

|     | Number_Of_Pages | Price      |
|-----|-----------------|------------|
| 269 | 3168.0          | 220.385294 |

Number\_Of\_Pages Type\_category :

|     | Number_Of_Pages | Type_category |
|-----|-----------------|---------------|
| 54  | 317             | 5             |
| 78  | 237             | 5             |
| 88  | 176             | 5             |
| 107 | 320             | 5             |
| 166 | 283             | 5             |
| 228 | 787             | 5             |
| 229 | 582             | 5             |

Price Rating :

|     | Price      | Rating |
|-----|------------|--------|
| 267 | 212.097059 | 3.94   |
| 268 | 220.385294 | 4.49   |
| 269 | 220.385294 | 4.77   |
| 270 | 235.650000 | 3.84   |

Price Reviews :

|   | Price     | Reviews |
|---|-----------|---------|
| 6 | 14.232353 | 5938.0  |

Price Number\_Of\_Pages :

|     | Price      | Number_Of_Pages |
|-----|------------|-----------------|
| 269 | 220.385294 | 3168.0          |

Price Type\_category :

|     | Price      | Type_category |
|-----|------------|---------------|
| 267 | 212.097059 | 3.0           |

Type\_category Rating :

|    | Type_category | Rating |
|----|---------------|--------|
| 54 | 5.0           | 5.0    |

Type\_category Reviews :

|     | Type_category | Reviews |
|-----|---------------|---------|
| 6   | 1             | 5938    |
| 54  | 5             | 0       |
| 78  | 5             | 33      |
| 88  | 5             | 161     |
| 107 | 5             | 18      |
| 166 | 5             | 57      |
| 228 | 5             | 88      |
| 229 | 5             | 3       |

Type\_category Number\_Of\_Pages :

|     | Type_category | Number_Of_Pages |
|-----|---------------|-----------------|
| 54  | 5             | 317             |
| 78  | 5             | 237             |
| 88  | 5             | 176             |
| 107 | 5             | 320             |
| 166 | 5             | 283             |
| 228 | 5             | 787             |
| 229 | 5             | 582             |

Type\_category Price :

|     | Type_category | Price      |
|-----|---------------|------------|
| 267 | 3.0           | 212.097059 |

### 1.2.2 all combinations of three variables

```
[128]: df["Type_category"] = df["Type"].astype('category').cat.codes
features = ["Rating", "Reviews", "Number_Of_Pages", "Price", "Type_category"]
i = 1
j = 0
fig = plt.figure(figsize=(20,60))

outliers = {}

for feature1 in features:
    for feature2 in features:
        if feature1 == feature2:
            continue
        for feature3 in features:
            if feature2 == feature3 or feature3 == feature1:
                continue
            ax = fig.add_subplot(15, 4, i, projection='3d')
            i += 1
            combined_feature = df[[feature1, feature2, feature3]].to_numpy()
            scaled_features = combined_feature.copy()
            # scale to 0,1
            scaler1 = MinMaxScaler()
            scaler1.fit(scaled_features[:,0].reshape(-1, 1))
            scaled_features[:,0] = scaler1.transform(scaled_features[:,0].
↪reshape(-1, 1)).reshape(-1)

            scaler2 = MinMaxScaler()
            scaler2.fit(scaled_features[:,1].reshape(-1, 1))
            scaled_features[:,1] = scaler2.transform(scaled_features[:,1].
↪reshape(-1, 1)).reshape(-1)

            scaler3 = MinMaxScaler()
            scaler3.fit(scaled_features[:,2].reshape(-1, 1))
            scaled_features[:,2] = scaler3.transform(scaled_features[:,2].
↪reshape(-1, 1)).reshape(-1)

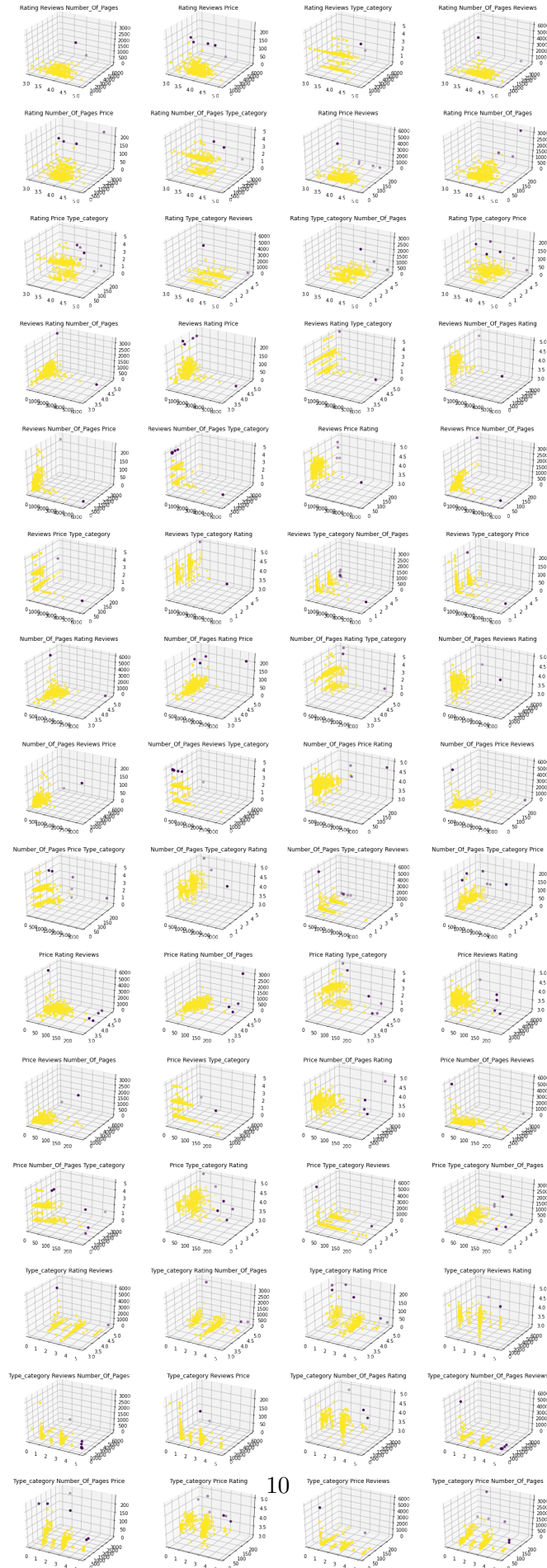
            clustering = DBSCAN(eps=0.3, min_samples=10).fit(scaled_features)
            labels = clustering.labels_

            title = feature1 + " " + feature2 + " " + feature3
            indexs = np.array(np.where(labels < 0)).reshape(-1)
            out = np.array(combined_feature[indexs])
            out = pd.DataFrame(data = out, index = indexs, columns = [feature1,
↪feature2, feature3])
            outliers[title] = out
```



```
ax.set_title(title)
ax.scatter3D(combined_feature[:,0], combined_feature[:,1],
↳combined_feature[:,2], c = labels)

plt.show()
```



```
[129]: print("Outlier indexs and values")
for title, outlier in outliers.items():
    print(title + " : ")
    display(outlier)
```

Outlier indexs and values

Rating Reviews Number\_Of\_Pages :

|     | Rating | Reviews | Number_Of_Pages |
|-----|--------|---------|-----------------|
| 6   | 4.09   | 5938.0  | 256.0           |
| 269 | 4.77   | 4.0     | 3168.0          |

Rating Reviews Price :

|     | Rating | Reviews | Price      |
|-----|--------|---------|------------|
| 6   | 4.09   | 5938.0  | 14.232353  |
| 267 | 3.94   | 22.0    | 212.097059 |
| 268 | 4.49   | 36.0    | 220.385294 |
| 269 | 4.77   | 4.0     | 220.385294 |
| 270 | 3.84   | 5.0     | 235.650000 |

Rating Reviews Type\_category :

|    | Rating | Reviews | Type_category |
|----|--------|---------|---------------|
| 6  | 4.09   | 5938.0  | 1.0           |
| 54 | 5.00   | 0.0     | 5.0           |

Rating Number\_Of\_Pages Reviews :

|     | Rating | Number_Of_Pages | Reviews |
|-----|--------|-----------------|---------|
| 6   | 4.09   | 256.0           | 5938.0  |
| 269 | 4.77   | 3168.0          | 4.0     |

Rating Number\_Of\_Pages Price :

|     | Rating | Number_Of_Pages | Price      |
|-----|--------|-----------------|------------|
| 267 | 3.94   | 1040.0          | 212.097059 |
| 268 | 4.49   | 896.0           | 220.385294 |
| 269 | 4.77   | 3168.0          | 220.385294 |
| 270 | 3.84   | 789.0           | 235.650000 |

Rating Number\_Of\_Pages Type\_category :

|     | Rating | Number_Of_Pages | Type_category |
|-----|--------|-----------------|---------------|
| 54  | 5.00   | 317.0           | 5.0           |
| 228 | 4.45   | 787.0           | 5.0           |
| 269 | 4.77   | 3168.0          | 1.0           |

Rating Price Reviews :

|   | Rating | Price     | Reviews |
|---|--------|-----------|---------|
| 6 | 4.09   | 14.232353 | 5938.0  |

|     |      |            |      |
|-----|------|------------|------|
| 267 | 3.94 | 212.097059 | 22.0 |
| 268 | 4.49 | 220.385294 | 36.0 |
| 269 | 4.77 | 220.385294 | 4.0  |
| 270 | 3.84 | 235.650000 | 5.0  |

Rating Price Number\_Of\_Pages :

|     | Rating | Price      | Number_Of_Pages |
|-----|--------|------------|-----------------|
| 267 | 3.94   | 212.097059 | 1040.0          |
| 268 | 4.49   | 220.385294 | 896.0           |
| 269 | 4.77   | 220.385294 | 3168.0          |
| 270 | 3.84   | 235.650000 | 789.0           |

Rating Price Type\_category :

|     | Rating | Price      | Type_category |
|-----|--------|------------|---------------|
| 54  | 5.00   | 25.855882  | 5.0           |
| 228 | 4.45   | 83.202941  | 5.0           |
| 267 | 3.94   | 212.097059 | 3.0           |
| 268 | 4.49   | 220.385294 | 0.0           |
| 269 | 4.77   | 220.385294 | 1.0           |
| 270 | 3.84   | 235.650000 | 1.0           |

Rating Type\_category Reviews :

|    | Rating | Type_category | Reviews |
|----|--------|---------------|---------|
| 6  | 4.09   | 1.0           | 5938.0  |
| 54 | 5.00   | 5.0           | 0.0     |

Rating Type\_category Number\_Of\_Pages :

|     | Rating | Type_category | Number_Of_Pages |
|-----|--------|---------------|-----------------|
| 54  | 5.00   | 5.0           | 317.0           |
| 228 | 4.45   | 5.0           | 787.0           |
| 269 | 4.77   | 1.0           | 3168.0          |

Rating Type\_category Price :

|     | Rating | Type_category | Price      |
|-----|--------|---------------|------------|
| 54  | 5.00   | 5.0           | 25.855882  |
| 228 | 4.45   | 5.0           | 83.202941  |
| 267 | 3.94   | 3.0           | 212.097059 |
| 268 | 4.49   | 0.0           | 220.385294 |
| 269 | 4.77   | 1.0           | 220.385294 |
| 270 | 3.84   | 1.0           | 235.650000 |

Reviews Rating Number\_Of\_Pages :

|     | Reviews | Rating | Number_Of_Pages |
|-----|---------|--------|-----------------|
| 6   | 5938.0  | 4.09   | 256.0           |
| 269 | 4.0     | 4.77   | 3168.0          |

Reviews Rating Price :

|     | Reviews | Rating | Price      |
|-----|---------|--------|------------|
| 6   | 5938.0  | 4.09   | 14.232353  |
| 267 | 22.0    | 3.94   | 212.097059 |
| 268 | 36.0    | 4.49   | 220.385294 |
| 269 | 4.0     | 4.77   | 220.385294 |
| 270 | 5.0     | 3.84   | 235.650000 |

Reviews Rating Type\_category :

|    | Reviews | Rating | Type_category |
|----|---------|--------|---------------|
| 6  | 5938.0  | 4.09   | 1.0           |
| 54 | 0.0     | 5.00   | 5.0           |

Reviews Number\_Of\_Pages Rating :

|     | Reviews | Number_Of_Pages | Rating |
|-----|---------|-----------------|--------|
| 6   | 5938.0  | 256.0           | 4.09   |
| 269 | 4.0     | 3168.0          | 4.77   |

Reviews Number\_Of\_Pages Price :

|     | Reviews | Number_Of_Pages | Price      |
|-----|---------|-----------------|------------|
| 6   | 5938.0  | 256.0           | 14.232353  |
| 269 | 4.0     | 3168.0          | 220.385294 |

Reviews Number\_Of\_Pages Type\_category :

|     | Reviews | Number_Of_Pages | Type_category |
|-----|---------|-----------------|---------------|
| 6   | 5938    | 256             | 1             |
| 54  | 0       | 317             | 5             |
| 78  | 33      | 237             | 5             |
| 88  | 161     | 176             | 5             |
| 107 | 18      | 320             | 5             |
| 166 | 57      | 283             | 5             |
| 228 | 88      | 787             | 5             |
| 229 | 3       | 582             | 5             |

Reviews Price Rating :

|     | Reviews | Price      | Rating |
|-----|---------|------------|--------|
| 6   | 5938.0  | 14.232353  | 4.09   |
| 267 | 22.0    | 212.097059 | 3.94   |
| 268 | 36.0    | 220.385294 | 4.49   |
| 269 | 4.0     | 220.385294 | 4.77   |
| 270 | 5.0     | 235.650000 | 3.84   |

Reviews Price Number\_Of\_Pages :

|     | Reviews | Price      | Number_Of_Pages |
|-----|---------|------------|-----------------|
| 6   | 5938.0  | 14.232353  | 256.0           |
| 269 | 4.0     | 220.385294 | 3168.0          |

Reviews Price Type\_category :

|     | Reviews | Price      | Type_category |
|-----|---------|------------|---------------|
| 6   | 5938.0  | 14.232353  | 1.0           |
| 267 | 22.0    | 212.097059 | 3.0           |

Reviews Type\_category Rating :

|    | Reviews | Type_category | Rating |
|----|---------|---------------|--------|
| 6  | 5938.0  | 1.0           | 4.09   |
| 54 | 0.0     | 5.0           | 5.00   |

Reviews Type\_category Number\_Of\_Pages :

|     | Reviews | Type_category | Number_Of_Pages |
|-----|---------|---------------|-----------------|
| 6   | 5938    | 1             | 256             |
| 54  | 0       | 5             | 317             |
| 78  | 33      | 5             | 237             |
| 88  | 161     | 5             | 176             |
| 107 | 18      | 5             | 320             |
| 166 | 57      | 5             | 283             |
| 228 | 88      | 5             | 787             |
| 229 | 3       | 5             | 582             |

Reviews Type\_category Price :

|     | Reviews | Type_category | Price      |
|-----|---------|---------------|------------|
| 6   | 5938.0  | 1.0           | 14.232353  |
| 267 | 22.0    | 3.0           | 212.097059 |

Number\_Of\_Pages Rating Reviews :

|     | Number_Of_Pages | Rating | Reviews |
|-----|-----------------|--------|---------|
| 6   | 256.0           | 4.09   | 5938.0  |
| 269 | 3168.0          | 4.77   | 4.0     |

Number\_Of\_Pages Rating Price :

|     | Number_Of_Pages | Rating | Price      |
|-----|-----------------|--------|------------|
| 267 | 1040.0          | 3.94   | 212.097059 |
| 268 | 896.0           | 4.49   | 220.385294 |
| 269 | 3168.0          | 4.77   | 220.385294 |
| 270 | 789.0           | 3.84   | 235.650000 |

Number\_Of\_Pages Rating Type\_category :

|     | Number_Of_Pages | Rating | Type_category |
|-----|-----------------|--------|---------------|
| 54  | 317.0           | 5.00   | 5.0           |
| 228 | 787.0           | 4.45   | 5.0           |
| 269 | 3168.0          | 4.77   | 1.0           |

Number\_Of\_Pages Reviews Rating :

|     | Number_Of_Pages | Reviews | Rating |
|-----|-----------------|---------|--------|
| 6   | 256.0           | 5938.0  | 4.09   |
| 269 | 3168.0          | 4.0     | 4.77   |

Number\_Of\_Pages Reviews Price :

|     | Number_Of_Pages | Reviews | Price      |
|-----|-----------------|---------|------------|
| 6   | 256.0           | 5938.0  | 14.232353  |
| 269 | 3168.0          | 4.0     | 220.385294 |

Number\_Of\_Pages Reviews Type\_category :

|     | Number_Of_Pages | Reviews | Type_category |
|-----|-----------------|---------|---------------|
| 6   | 256             | 5938    | 1             |
| 54  | 317             | 0       | 5             |
| 78  | 237             | 33      | 5             |
| 88  | 176             | 161     | 5             |
| 107 | 320             | 18      | 5             |
| 166 | 283             | 57      | 5             |
| 228 | 787             | 88      | 5             |
| 229 | 582             | 3       | 5             |

Number\_Of\_Pages Price Rating :

|     | Number_Of_Pages | Price      | Rating |
|-----|-----------------|------------|--------|
| 267 | 1040.0          | 212.097059 | 3.94   |
| 268 | 896.0           | 220.385294 | 4.49   |
| 269 | 3168.0          | 220.385294 | 4.77   |
| 270 | 789.0           | 235.650000 | 3.84   |

Number\_Of\_Pages Price Reviews :

|     | Number_Of_Pages | Price      | Reviews |
|-----|-----------------|------------|---------|
| 6   | 256.0           | 14.232353  | 5938.0  |
| 269 | 3168.0          | 220.385294 | 4.0     |

Number\_Of\_Pages Price Type\_category :

|     | Number_Of_Pages | Price      | Type_category |
|-----|-----------------|------------|---------------|
| 228 | 787.0           | 83.202941  | 5.0           |
| 229 | 582.0           | 83.211765  | 5.0           |
| 267 | 1040.0          | 212.097059 | 3.0           |
| 268 | 896.0           | 220.385294 | 0.0           |
| 269 | 3168.0          | 220.385294 | 1.0           |
| 270 | 789.0           | 235.650000 | 1.0           |

Number\_Of\_Pages Type\_category Rating :

|     | Number_Of_Pages | Type_category | Rating |
|-----|-----------------|---------------|--------|
| 54  | 317.0           | 5.0           | 5.00   |
| 228 | 787.0           | 5.0           | 4.45   |
| 269 | 3168.0          | 1.0           | 4.77   |

Number\_Of\_Pages Type\_category Reviews :

|    | Number_Of_Pages | Type_category | Reviews |
|----|-----------------|---------------|---------|
| 6  | 256             | 1             | 5938    |
| 54 | 317             | 5             | 0       |

|     |     |   |     |
|-----|-----|---|-----|
| 78  | 237 | 5 | 33  |
| 88  | 176 | 5 | 161 |
| 107 | 320 | 5 | 18  |
| 166 | 283 | 5 | 57  |
| 228 | 787 | 5 | 88  |
| 229 | 582 | 5 | 3   |

Number\_Of\_Pages Type\_category Price :

|     | Number_Of_Pages | Type_category | Price      |
|-----|-----------------|---------------|------------|
| 228 | 787.0           | 5.0           | 83.202941  |
| 229 | 582.0           | 5.0           | 83.211765  |
| 267 | 1040.0          | 3.0           | 212.097059 |
| 268 | 896.0           | 0.0           | 220.385294 |
| 269 | 3168.0          | 1.0           | 220.385294 |
| 270 | 789.0           | 1.0           | 235.650000 |

Price Rating Reviews :

|     | Price      | Rating | Reviews |
|-----|------------|--------|---------|
| 6   | 14.232353  | 4.09   | 5938.0  |
| 267 | 212.097059 | 3.94   | 22.0    |
| 268 | 220.385294 | 4.49   | 36.0    |
| 269 | 220.385294 | 4.77   | 4.0     |
| 270 | 235.650000 | 3.84   | 5.0     |

Price Rating Number\_Of\_Pages :

|     | Price      | Rating | Number_Of_Pages |
|-----|------------|--------|-----------------|
| 267 | 212.097059 | 3.94   | 1040.0          |
| 268 | 220.385294 | 4.49   | 896.0           |
| 269 | 220.385294 | 4.77   | 3168.0          |
| 270 | 235.650000 | 3.84   | 789.0           |

Price Rating Type\_category :

|     | Price      | Rating | Type_category |
|-----|------------|--------|---------------|
| 54  | 25.855882  | 5.00   | 5.0           |
| 228 | 83.202941  | 4.45   | 5.0           |
| 267 | 212.097059 | 3.94   | 3.0           |
| 268 | 220.385294 | 4.49   | 0.0           |
| 269 | 220.385294 | 4.77   | 1.0           |
| 270 | 235.650000 | 3.84   | 1.0           |

Price Reviews Rating :

|     | Price      | Reviews | Rating |
|-----|------------|---------|--------|
| 6   | 14.232353  | 5938.0  | 4.09   |
| 267 | 212.097059 | 22.0    | 3.94   |
| 268 | 220.385294 | 36.0    | 4.49   |
| 269 | 220.385294 | 4.0     | 4.77   |
| 270 | 235.650000 | 5.0     | 3.84   |



Price Reviews Number\_Of\_Pages :

|     | Price      | Reviews | Number_Of_Pages |
|-----|------------|---------|-----------------|
| 6   | 14.232353  | 5938.0  | 256.0           |
| 269 | 220.385294 | 4.0     | 3168.0          |

Price Reviews Type\_category :

|     | Price      | Reviews | Type_category |
|-----|------------|---------|---------------|
| 6   | 14.232353  | 5938.0  | 1.0           |
| 267 | 212.097059 | 22.0    | 3.0           |

Price Number\_Of\_Pages Rating :

|     | Price      | Number_Of_Pages | Rating |
|-----|------------|-----------------|--------|
| 267 | 212.097059 | 1040.0          | 3.94   |
| 268 | 220.385294 | 896.0           | 4.49   |
| 269 | 220.385294 | 3168.0          | 4.77   |
| 270 | 235.650000 | 789.0           | 3.84   |

Price Number\_Of\_Pages Reviews :

|     | Price      | Number_Of_Pages | Reviews |
|-----|------------|-----------------|---------|
| 6   | 14.232353  | 256.0           | 5938.0  |
| 269 | 220.385294 | 3168.0          | 4.0     |

Price Number\_Of\_Pages Type\_category :

|     | Price      | Number_Of_Pages | Type_category |
|-----|------------|-----------------|---------------|
| 228 | 83.202941  | 787.0           | 5.0           |
| 229 | 83.211765  | 582.0           | 5.0           |
| 267 | 212.097059 | 1040.0          | 3.0           |
| 268 | 220.385294 | 896.0           | 0.0           |
| 269 | 220.385294 | 3168.0          | 1.0           |
| 270 | 235.650000 | 789.0           | 1.0           |

Price Type\_category Rating :

|     | Price      | Type_category | Rating |
|-----|------------|---------------|--------|
| 54  | 25.855882  | 5.0           | 5.00   |
| 228 | 83.202941  | 5.0           | 4.45   |
| 267 | 212.097059 | 3.0           | 3.94   |
| 268 | 220.385294 | 0.0           | 4.49   |
| 269 | 220.385294 | 1.0           | 4.77   |
| 270 | 235.650000 | 1.0           | 3.84   |

Price Type\_category Reviews :

|     | Price      | Type_category | Reviews |
|-----|------------|---------------|---------|
| 6   | 14.232353  | 1.0           | 5938.0  |
| 267 | 212.097059 | 3.0           | 22.0    |

Price Type\_category Number\_Of\_Pages :

|     | Price      | Type_category | Number_Of_Pages |
|-----|------------|---------------|-----------------|
| 228 | 83.202941  | 5.0           | 787.0           |
| 229 | 83.211765  | 5.0           | 582.0           |
| 267 | 212.097059 | 3.0           | 1040.0          |
| 268 | 220.385294 | 0.0           | 896.0           |
| 269 | 220.385294 | 1.0           | 3168.0          |
| 270 | 235.650000 | 1.0           | 789.0           |

Type\_category Rating Reviews :

|    | Type_category | Rating | Reviews |
|----|---------------|--------|---------|
| 6  | 1.0           | 4.09   | 5938.0  |
| 54 | 5.0           | 5.00   | 0.0     |

Type\_category Rating Number\_Of\_Pages :

|     | Type_category | Rating | Number_Of_Pages |
|-----|---------------|--------|-----------------|
| 54  | 5.0           | 5.00   | 317.0           |
| 228 | 5.0           | 4.45   | 787.0           |
| 269 | 1.0           | 4.77   | 3168.0          |

Type\_category Rating Price :

|     | Type_category | Rating | Price      |
|-----|---------------|--------|------------|
| 54  | 5.0           | 5.00   | 25.855882  |
| 228 | 5.0           | 4.45   | 83.202941  |
| 267 | 3.0           | 3.94   | 212.097059 |
| 268 | 0.0           | 4.49   | 220.385294 |
| 269 | 1.0           | 4.77   | 220.385294 |
| 270 | 1.0           | 3.84   | 235.650000 |

Type\_category Reviews Rating :

|    | Type_category | Reviews | Rating |
|----|---------------|---------|--------|
| 6  | 1.0           | 5938.0  | 4.09   |
| 54 | 5.0           | 0.0     | 5.00   |

Type\_category Reviews Number\_Of\_Pages :

|     | Type_category | Reviews | Number_Of_Pages |
|-----|---------------|---------|-----------------|
| 6   | 1             | 5938    | 256             |
| 54  | 5             | 0       | 317             |
| 78  | 5             | 33      | 237             |
| 88  | 5             | 161     | 176             |
| 107 | 5             | 18      | 320             |
| 166 | 5             | 57      | 283             |
| 228 | 5             | 88      | 787             |
| 229 | 5             | 3       | 582             |

Type\_category Reviews Price :

|     | Type_category | Reviews | Price      |
|-----|---------------|---------|------------|
| 6   | 1.0           | 5938.0  | 14.232353  |
| 267 | 3.0           | 22.0    | 212.097059 |

Type\_category Number\_Of\_Pages Rating :

|     | Type_category | Number_Of_Pages | Rating |
|-----|---------------|-----------------|--------|
| 54  | 5.0           | 317.0           | 5.00   |
| 228 | 5.0           | 787.0           | 4.45   |
| 269 | 1.0           | 3168.0          | 4.77   |

Type\_category Number\_Of\_Pages Reviews :

|     | Type_category | Number_Of_Pages | Reviews |
|-----|---------------|-----------------|---------|
| 6   | 1             | 256             | 5938    |
| 54  | 5             | 317             | 0       |
| 78  | 5             | 237             | 33      |
| 88  | 5             | 176             | 161     |
| 107 | 5             | 320             | 18      |
| 166 | 5             | 283             | 57      |
| 228 | 5             | 787             | 88      |
| 229 | 5             | 582             | 3       |

Type\_category Number\_Of\_Pages Price :

|     | Type_category | Number_Of_Pages | Price      |
|-----|---------------|-----------------|------------|
| 228 | 5.0           | 787.0           | 83.202941  |
| 229 | 5.0           | 582.0           | 83.211765  |
| 267 | 3.0           | 1040.0          | 212.097059 |
| 268 | 0.0           | 896.0           | 220.385294 |
| 269 | 1.0           | 3168.0          | 220.385294 |
| 270 | 1.0           | 789.0           | 235.650000 |

Type\_category Price Rating :

|     | Type_category | Price      | Rating |
|-----|---------------|------------|--------|
| 54  | 5.0           | 25.855882  | 5.00   |
| 228 | 5.0           | 83.202941  | 4.45   |
| 267 | 3.0           | 212.097059 | 3.94   |
| 268 | 0.0           | 220.385294 | 4.49   |
| 269 | 1.0           | 220.385294 | 4.77   |
| 270 | 1.0           | 235.650000 | 3.84   |

Type\_category Price Reviews :

|     | Type_category | Price      | Reviews |
|-----|---------------|------------|---------|
| 6   | 1.0           | 14.232353  | 5938.0  |
| 267 | 3.0           | 212.097059 | 22.0    |

Type\_category Price Number\_Of\_Pages :

|     | Type_category | Price      | Number_Of_Pages |
|-----|---------------|------------|-----------------|
| 228 | 5.0           | 83.202941  | 787.0           |
| 229 | 5.0           | 83.211765  | 582.0           |
| 267 | 3.0           | 212.097059 | 1040.0          |
| 268 | 0.0           | 220.385294 | 896.0           |

|     |     |            |        |
|-----|-----|------------|--------|
| 269 | 1.0 | 220.385294 | 3168.0 |
| 270 | 1.0 | 235.650000 | 789.0  |