Part 2 Data Optimization

Prepared by:

```
Step 1 : Install and Import Libraries
```

```
In [ ]: from pyspark.sql import SparkSession
        from pyspark.sql.types import StringType, NumericType
        from pyspark.sql.functions import col, upper, regexp_replace, when, isnan, count, lit, mean, sum as spark_sum, avg
        from pyspark.sql import functions as F
        from functools import reduce
        import pandas as pd
        import re
        import time
        import tracemalloc
        import psutil
        spark = SparkSession.builder.appName("ExcelProcessing").getOrCreate()
        Step 2 : Upload Excel Files
       from google.colab import files
        uploaded = files.upload()
       Choose Files No file chosen
                                          Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.
       Saving pyspark_cleaned_dataset.csv to pyspark_cleaned_dataset.csv
```

Step 3: Load and Display Dataset, Checking on Total Numbers of Rows and Columns

```
In [ ]: %%time
       tracemalloc.start()
       start_time = time.perf_counter()
       total_rows = 0
       filename = list(uploaded.keys())[0]
       df_cleaned = spark.read.csv(
           filename,
           header=True,
           inferSchema=True,
           quote='"',
           escape='"',
           multiLine=True
       display(df_cleaned.limit(10).toPandas())
       total_rows = df_cleaned.count()
       total_columns = len(df_cleaned.columns)
       print(f"Total rows: {total_rows}")
       print(f"Total columns: {total_columns}")
       current, peak = tracemalloc.get_traced_memory()
       end_time = time.perf_counter()
       tracemalloc.stop()
       execution_time = end_time - start_time
       throughput = total_rows / execution_time
       print("========\n")
       print(f"Total rows processed: {total_rows}")
       print(f"Code Execution time: {execution_time:.4f} seconds")
       print(f"Throughput: {throughput:.2f} rows per second")
       print(f"Current memory usage: {current / 10**6:.4f} MB")
       print(f"Peak memory usage: {peak / 10**6:.4f} MB")
       cpu_usage = psutil.cpu_percent(interval=1)
       print(f"CPU usage: {cpu_usage}%")
       print("======"")
       print("\nTotal time for this cell(Including time to display the performance):")
```

			Location	Quantity Sold	Total Reviews	Category
0 100	ORIGINAL GLOW FOUNDATION BY HQ EKIN BEAUTY SPF60	8.29	PERAK	0	1	BEAUTY & SKINCARE
1 B	BEAUTY FORMULAS MAKE UP REMOVER CLEANSING FACI	8.90	JOHOR	592	93	BEAUTY & SKINCARE
2	BIOAQUA PAPAYA CLEANSING WITH VITAMINS 100 GRAM	10.00	WP KUALA LUMPUR	49	6	BEAUTY & SKINCARE
3	FACIAL CLEANSER WHITENING AND FRECKLE REMOVING	7.39	SELANGOR	484	132	BEAUTY & SKINCARE
4	ALOE VERA 99% SOOTHING GEL LIPSTICK LIP BALM	8.50	WP KUALA LUMPUR	178	44	BEAUTY & SKINCARE
5	20G CHEILITIS CREAM LIP CARE CHEILITIS REPAIR	9.14	CHINA	31	8	BEAUTY & SKINCARE
6 SNEF	E WHITE LILY HYDRATING CLEANSER 雪玲妃氨基酸洗面奶	12.00	PENANG	47	20	BEAUTY & SKINCARE
7	LIP PLUMP SERUM INCREASE LIP ELASTICITY REDUCE	7.61	CHINA	6	1	BEAUTY & SKINCARE
8	SABUN GLOW GLOWING READY STOCK	9.20	KELANTAN	0	0	BEAUTY & SKINCARE
9	SAFI YOUTH GOLD SERIES (FACIAL CLEANSER / EXFO	10.41	PERAK	0	0	BEAUTY & SKINCARE

Total rows: 113596
Total columns: 6

Total rows processed: 113596
Code Execution time: 13.9451 seconds
Throughput: 8145.97 rows per second
Current memory usage: 3.5778 MB
Peak memory usage: 3.9638 MB
CPU usage: 29.5%

Total time for this cell(Including time to display the performance): CPU times: user 824 ms, sys: 43.3 ms, total: 867 ms Wall time: 15 s

Step 4 : Dividing Products into 4 Categories Based on Price using Pandas

In []: **%%time**

```
tracemalloc.start()
start_time = time.perf_counter()
total_rows = df_cleaned.count()
df_price = df_cleaned.filter(F.col("Price") > 0)
q1 = df_price.approxQuantile("Price", [0.25], 0.0)[0]
q3 = df_price.approxQuantile("Price", [0.75], 0.0)[0]
iqr = q3 - q1
lower\_bound = q1 - 1.5 * iqr
upper_bound = q3 + 1.5 * iqr
df_cleared = df_price.filter((F.col("Price") >= lower_bound) & (F.col("Price") <= upper_bound))</pre>
min_price = df_cleared.agg(F.min("Price")).collect()[0][0]
max_price = df_cleared.agg(F.max("Price")).collect()[0][0]
print(f"Min Price: {min_price}")
print(f"Max Price: {max_price}")
price_range = (max_price - min_price) / 4
bound1 = min_price + price_range
bound2 = min_price + 2 * price_range
bound3 = min_price + 3 * price_range
group1 = df_price.filter(F.col("Price") <= bound1)</pre>
group2 = df_price.filter((F.col("Price") > bound1) & (F.col("Price") <= bound2))</pre>
group3 = df_price.filter((F.col("Price") > bound2) & (F.col("Price") <= bound3))</pre>
group4 = df_price.filter(F.col("Price") > bound3)
print(f"\nGroup 1 (Budget Friendly Price): {group1.count()} products")
print(f"Group 2 (Affordable Price): {group2.count()} products")
print(f"Group 3 (Mid-Range Price): {group3.count()} products")
print(f"Group 4 (Premium Price): {group4.count()} products")
def print_category_counts(df):
    print(" Category count:")
    category_counts = df.groupBy("Category").count().orderBy("count", ascending=False)
    for row in category_counts.collect():
       print(f"- {row['Category']}: {row['count']} products")
print("\nGroup 1 (Budget Friendly Price):")
display(group1.limit(10).toPandas())
print(f"Total rows: {group1.count()}")
print(f"Total columns: {len(group1.columns)}\n")
print_category_counts(group1)
```

```
print("\nGroup 2 (Affordable Price):")
 display(group2.limit(10).toPandas())
 print(f"Total rows: {group2.count()}")
 print(f"Total columns: {len(group2.columns)}\n")
 print_category_counts(group2)
 print("\nGroup 3 (Mid-Range Price):")
 display(group3.limit(10).toPandas())
 print(f"Total rows: {group3.count()}")
 print(f"Total columns: {len(group3.columns)}\n")
 print_category_counts(group3)
 print("\nGroup 4 (Premium Price):")
 display(group4.limit(10).toPandas())
 print(f"Total rows: {group4.count()}")
 print(f"Total columns: {len(group4.columns)}\n")
 print_category_counts(group4)
 total_rows = df_price.count()
 current, peak = tracemalloc.get_traced_memory()
 end_time = time.perf_counter()
 tracemalloc.stop()
 execution_time = end_time - start_time
 throughput = total_rows / execution_time if execution_time > 0 else 0
 print("\n========\n")
 print(f"Total rows processed: {total_rows:,}")
 print(f"Code Execution time: {execution_time:.4f} seconds")
 print(f"Throughput: {throughput:,.2f} rows per second")
 print(f"Current memory usage: {current / 10**6:.4f} MB")
 print(f"Peak memory usage: {peak / 10**6:.4f} MB")
 cpu_usage = psutil.cpu_percent(interval=1)
 print(f"CPU usage: {cpu_usage}%")
 print("\nTotal time for this cell (Including time to display the performance):")
Min Price: 0.05
Max Price: 172.82
```

Group 1 (Budget Friendly Price):

Group 1 (Budget Friendly Price): 65992 products Group 2 (Affordable Price): 22626 products Group 3 (Mid-Range Price): 10327 products Group 4 (Premium Price): 14651 products

	Product Name	Price	Location	Quantity Sold	Total Reviews	Category
0	ORIGINAL GLOW FOUNDATION BY HQ EKIN BEAUTY SPF60	8.29	PERAK	0	1	BEAUTY & SKINCARE
1	BEAUTY FORMULAS MAKE UP REMOVER CLEANSING FACI	8.90	JOHOR	592	93	BEAUTY & SKINCARE
2	BIOAQUA PAPAYA CLEANSING WITH VITAMINS 100 GRAM	10.00	WP KUALA LUMPUR	49	6	BEAUTY & SKINCARE
3	FACIAL CLEANSER WHITENING AND FRECKLE REMOVING	7.39	SELANGOR	484	132	BEAUTY & SKINCARE
4	ALOE VERA 99% SOOTHING GEL LIPSTICK LIP BALM	8.50	WP KUALA LUMPUR	178	44	BEAUTY & SKINCARE
5	20G CHEILITIS CREAM LIP CARE CHEILITIS REPAIR	9.14	CHINA	31	8	BEAUTY & SKINCARE
6	SNEFE WHITE LILY HYDRATING CLEANSER 雪玲妃氨基酸洗面奶	12.00	PENANG	47	20	BEAUTY & SKINCARE
7	LIP PLUMP SERUM INCREASE LIP ELASTICITY REDUCE	7.61	CHINA	6	1	BEAUTY & SKINCARE
8	SABUN GLOW GLOWING READY STOCK	9.20	KELANTAN	0	0	BEAUTY & SKINCARE
9	SAFI YOUTH GOLD SERIES (FACIAL CLEANSER / EXFO	10.41	PERAK	0	0	BEAUTY & SKINCARE

Total rows: 65992
Total columns: 6

Category count:
- STATIONERY: 20460 products
- BEAUTY & SKINCARE: 17957 products
- HEALTH & WELLNESS: 10315 products
- HOME & LIVING: 8293 products
- WOMEN'S FASHION: 4653 products
- HOME APPLIANCES: 3837 products
- MOTHER & BABY: 477 products

Group 2 (Affordable Price):

	Product Name	Price	Location	Quantity Sold	Total Reviews	Category
0	AR COLLAGEN PLUS DIETARY SUPPLEMENT PRODUCT	45.00	KELANTAN	7	2	BEAUTY & SKINCARE
1	[READY STOK] FRESKIN WHITE WHITENING BODY SHOW	47.00	JOHOR	0	1	BEAUTY & SKINCARE
2	BODY BUTTER STICK MOISTURIZING BODY CREAM MOIS	45.84	CHINA	0	0	BEAUTY & SKINCARE
3	CETAPHIL HYDRATING FOAMING CREAM CLEANSER 236ML	43.90	SELANGOR	0	0	BEAUTY & SKINCARE
4	PAPULEX MOUSSANT SOAP FREE CLEANSING GEL 150ML	69.21	KEDAH	830	203	BEAUTY & SKINCARE
5	DERMAREL LIPID REPLENISHING CLEANSER 400ML S	50.90	SELANGOR	277	53	BEAUTY & SKINCARE
6	*RJ BEAUTY BOOSTER WHITENING SOAP	61.68	SELANGOR	0	0	BEAUTY & SKINCARE
7	EXP AUG 2025 DR.WU OFFICIAL RENEWAL CLEANSING	72.50	SELANGOR	160	29	BEAUTY & SKINCARE
8	TAIWAN AMINO ACID CLEANSING MILK TRUU 76 YEAST	64.60	CHINA	0	0	BEAUTY & SKINCARE
9	THE FACE SHOP DAILY PERFUMED FOAM CLEANSER HOL	49.00	NEGERI SEMBILAN	0	1	BEAUTY & SKINCARE

Total rows: 22626 Total columns: 6

Category count:

- HEALTH & WELLNESS: 6380 produ - BEAUTY & SKINCARE: 5373 produ - WOMEN'S FASHION: 3623 product - HOME APPLIANCES: 3053 product - HOME & LIVING: 2309 products - STATIONERY: 1170 products - MOTHER & BABY: 718 products

Group 3 (Mid-Range Price):

	Product Name	Price	Location	Quantity Sold	Total Reviews	Category
0	APRIL22 SKIN ENERGY PURIFYING CLEANSER 120G能量活	96.00	JOHOR	6	4	BEAUTY & SKINCARE
1	TEOXANE RHA™ MICELLAR SOLUTION 200ML	129.00	SELANGOR	14	0	BEAUTY & SKINCARE
2	NUXE REVE DE MIEL FACE CLEANSING & MAKEUP REMO	96.10	CHINA	12	0	BEAUTY & SKINCARE
3	PAULA'S CHOICE SKIN BALANCING OIL-REDUCING CLE	108.00	SELANGOR	136	43	BEAUTY & SKINCARE
4	CLINIQUE RINSE-OFF FOAMING CLEANSER 150ML	93.69	CHINA	14	4	BEAUTY & SKINCARE
5	LA ROCHE-POSAY TOLERIANE PURIFYING FOAMING CRE	103.22	SOUTH KOREA	0	0	BEAUTY & SKINCARE
6	SHISEIDO MEN CLEANSING FOAM 125ML	92.40	HONG KONG	148	41	BEAUTY & SKINCARE
7	FRESH - SUGAR LIP TREATMENT - COCOA 4.3G/0.15OZ	107.13	CHINA	0	0	BEAUTY & SKINCARE
8	NU SKIN NUSKIN LUMISPA TREATMENT HEAD - READY	129.00	SELANGOR	0	0	BEAUTY & SKINCARE
9	PURA D'OR ORGANIC BEARD OIL, MUSTACHE CARE, MI	87.82	SELANGOR	5	0	BEAUTY & SKINCARE

Total rows: 10327 Total columns: 6

Category count:

- HEALTH & WELLNESS: 3866 produ - BEAUTY & SKINCARE: 2008 produ - HOME APPLIANCES: 1938 product - HOME & LIVING: 977 products - WOMEN'S FASHION: 774 products - STATIONERY: 451 products

- MOTHER & BABY: 313 products

Group 4 (Premium Price):

SUPPLEMENT PRODUCT	45.00	I/CL ANITAL	NI.	7	2 DEALITY OF CHARGASE
		KELANTAN		7	2 BEAUTY & SKINCARE
HITENING BODY SHOW		JOHOF		0	1 BEAUTY & SKINCARE
NG BODY CREAM MOIS		CHINA		0	0 BEAUTY & SKINCARE
CREAM CLEANSER 236ML		SELANGOR		0	0 BEAUTY & SKINCARE
CLEANSING GEL 150ML		KEDAH			203 BEAUTY & SKINCARE
IG CLEANSER 400ML S		SELANGOF			53 BEAUTY & SKINCARE
OSTER WHITENING SOAP		SELANGOF		0	0 BEAUTY & SKINCARE
RENEWAL CLEANSING		SELANGOF			29 BEAUTY & SKINCARE
G MILK TRUU 76 YEAST	64.60	CHINA	A	0	0 BEAUTY & SKINCARE
FOAM CLEANSER HOL	49.00	NEGERI SEMBILAN	N	0	1 BEAUTY & SKINCARE
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ts					
Product Name			Quantity Sold		
CLEANSER 120G能量活	96.00	JOHOR	6		4 BEAUTY & SKINCARE
ELLAR SOLUTION 200ML			14		BEAUTY & SKINCARE
SING & MAKEUP REMO	96.10	CHINA	12		BEAUTY & SKINCARE
NG OIL-REDUCING CLE	108.00	SELANGOR	136	43	BEAUTY & SKINCARE
MING CLEANSER 150ML	93.69	CHINA	14	4	4 BEAUTY & SKINCARE
RIFYING FOAMING CRE	103.22	SOUTH KOREA	0	C	BEAUTY & SKINCARE
LEANSING FOAM 125ML	92.40	HONG KONG	148	41	1 BEAUTY & SKINCARE
NT - COCOA 4.3G/0.15OZ	107.13	CHINA	0	C	BEAUTY & SKINCARE
TMENT HEAD - READY	129.00	SELANGOR	0	C	BEAUTY & SKINCARE
L, MUSTACHE CARE, MI	87.82	SELANGOR	5	C	BEAUTY & SKINCARE
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```
Product Name Price
                                                                 Location Quantity Sold Total Reviews
                                                                                                            Category
      LOTUS HERBALS RADIANT PEARL CELLULAR FACIAL KI... 130.00
                                                                SELANGOR
                                                                                                 0 BEAUTY & SKINCARE
     ESTEE LAUDER PERFECTLY CLEAN MULTI-ACTION FOAM... 165.09
                                                                   JOHOR
                                                                                                 0 BEAUTY & SKINCARE
      D'ALBA | MILD SKIN BALANCING VEGAN CLEANSER (2... 148.03
                                                             SOUTH KOREA
                                                                                                 0 BEAUTY & SKINCARE
       PERSONALIZED MINI SKINCARE BEAUTY FRIDGE 8L - ... 160.00
                                                                   PERAK
                                                                                                 0 BEAUTY & SKINCARE
            CAMELLA APRICOT FACIAL FOAMING CLEANSER 144.90
                                                                SELANGOR
                                                                                  126
                                                                                                20 BEAUTY & SKINCARE
5 BIOTHERM FORCE SUPREME ANTI-AGING CLEANSER 125ML 234.80
                                                              HONG KONG
                                                                                                12 BEAUTY & SKINCARE
        [NSC] S.LITE 60 CAPSULES 450MG (SHORT EXPIRY N... 245.17 WP KUALA LUMPUR
                                                                                                 0 BEAUTY & SKINCARE
           LA PRAIRIE PURIFYING CREAM CLEANSER 200ML 268.30
                                                                   CHINA
                                                                                                 1 BEAUTY & SKINCARE
     HANA SAPPHIRE AIR IPL HAIR REMOVAL MACHINE DEV... 967.13
                                                                SELANGOR
                                                                                                 1 BEAUTY & SKINCARE
   PEVONIA MALAYSIA - LUMAFIRM® BODY MOISTURIZER ... 380.00
                                                                SELANGOR
                                                                                    0
                                                                                                 1 BEAUTY & SKINCARE
Total rows: 14651
Total columns: 6
 Category count:
- HOME APPLIANCES: 4700 products
- HEALTH & WELLNESS: 3581 products
- BEAUTY & SKINCARE: 2388 products
- HOME & LIVING: 1642 products
- MOTHER & BABY: 923 products
- STATIONERY: 794 products
- WOMEN'S FASHION: 623 products
```

Total rows processed: 113,596

Code Execution time: 22.6163 seconds
Throughput: 5,022.74 rows per second
Current memory usage: 0.2022 MB
Peak memory usage: 0.3516 MB

CPU usage: 5.5%

Total time for this cell (Including time to display the performance): CPU times: user 1.03 s, sys: 43.9 ms, total: 1.07 s Wall time: 23.6 s

Step 5 : Filtering Based on 'Total Reviews' to Determine Popularity of Products

```
In [ ]: %%time
        tracemalloc.start()
        start_time = time.perf_counter()
        Q1 = df_cleaned.approxQuantile("Total Reviews", [0.25], 0.0)[0]
        Q3 = df_cleaned.approxQuantile("Total Reviews", [0.75], 0.0)[0]
        IQR = Q3 - Q1
        lower_bound = Q1 - 1.5 * IQR
        upper_bound = Q3 + 1.5 * IQR
        df_filtered = df_cleaned.filter(
            (F.col("Total Reviews") >= lower bound) & (F.col("Total Reviews") <= upper bound)</pre>
        min_ratings = df_filtered.agg(F.min("Total Reviews")).collect()[0][0]
        max_ratings = df_filtered.agg(F.max("Total Reviews")).collect()[0][0]
        print(f"Filtered minimum: {min_ratings}")
        print(f"Filtered maximum: {max_ratings}")
        rating_range = round((max_ratings - min_ratings) / 4)
        bound1 = min_ratings + rating_range
        bound2 = min_ratings + 2 * rating_range
        bound3 = min_ratings + 3 * rating_range
        group1 = df_filtered.filter(F.col("Total Reviews") <= bound1)</pre>
        group2 = df_filtered.filter((F.col("Total Reviews") > bound1) & (F.col("Total Reviews") <= bound2))</pre>
        group3 = df_filtered.filter((F.col("Total Reviews") > bound2) & (F.col("Total Reviews") <= bound3))</pre>
        group4 = df_filtered.filter(F.col("Total Reviews") > bound3)
        print(f"\nGroup 1 (Least popular): {group1.count()} products")
        print(f"Group 2 (Below Average Popularity): {group2.count()} products")
        print(f"Group 3 (Above Average Popularity): {group3.count()} products")
        print(f"Group 4 (Most popular): {group4.count()} products")
        def print_category_counts(df):
            print("  Category count:")
            category_counts = df.groupBy("Category").count().orderBy("count", ascending=False)
```

```
for row in category_counts.collect():
         print(f"- {row['Category']}: {row['count']} products")
 print("\nGroup 1 (Least popular):")
 display(group1.limit(10).toPandas())
 print(f"Total rows: {group1.count()}")
 print(f"Total columns: {len(group1.columns)}\n")
 print_category_counts(group1)
 print("\nGroup 2 (Below Average Popularity):")
 display(group2.limit(10).toPandas())
 print(f"Total rows: {group2.count()}")
 print(f"Total columns: {len(group2.columns)}\n")
 print_category_counts(group2)
 print("\nGroup 3 (Above Average Popularity):")
 display(group3.limit(10).toPandas())
 print(f"Total rows: {group3.count()}")
 print(f"Total columns: {len(group3.columns)}\n")
 print_category_counts(group3)
 print("\nGroup 4 (Most popular):")
 display(group4.limit(10).toPandas())
 print(f"Total rows: {group4.count()}")
 print(f"Total columns: {len(group4.columns)}\n")
 print_category_counts(group4)
 total_rows = df_cleaned.count()
 current, peak = tracemalloc.get_traced_memory()
 end_time = time.perf_counter()
 tracemalloc.stop()
 execution_time = end_time - start_time
 throughput = total_rows / execution_time if execution_time > 0 else 0
 print("\n========\n")
 print(f"Total rows processed: {total_rows:,}")
 print(f"Code Execution time: {execution_time:.4f} seconds")
 print(f"Throughput: {throughput:,.2f} rows per second")
 print(f"Current memory usage: {current / 10**6:.4f} MB")
 print(f"Peak memory usage: {peak / 10**6:.4f} MB")
 cpu_usage = psutil.cpu_percent(interval=1)
 print(f"CPU usage: {cpu_usage}%")
 print("\nTotal time for this cell (Including time to display the performance):")
Filtered minimum: 0
Filtered maximum: 27
```

Group 1 (Least popular):

Group 1 (Least popular): 80729 products

Group 4 (Most popular): 2783 products

Group 2 (Below Average Popularity): 7845 products Group 3 (Above Average Popularity): 4653 products

	Product Name	Price	Location	Quantity Sold	Total Reviews	Category
0	ORIGINAL GLOW FOUNDATION BY HQ EKIN BEAUTY SPF60	8.29	PERAK	0	1	BEAUTY & SKINCARE
1	BIOAQUA PAPAYA CLEANSING WITH VITAMINS 100 GRAM	10.00	WP KUALA LUMPUR	49	6	BEAUTY & SKINCARE
2	LIP PLUMP SERUM INCREASE LIP ELASTICITY REDUCE	7.61	CHINA	6	1	BEAUTY & SKINCARE
3	SABUN GLOW GLOWING READY STOCK	9.20	KELANTAN	0	0	BEAUTY & SKINCARE
4	SAFI YOUTH GOLD SERIES (FACIAL CLEANSER / EXFO	10.41	PERAK	0	0	BEAUTY & SKINCARE
5	[HEALTHCARE.ONLINE PHARMACY] JF SULFUR SKIN SO	8.80	JOHOR	0	0	BEAUTY & SKINCARE
6	[CLEARANCE] HIMALAYA MOISTURISING ALOE VERA FA	8.30	SELANGOR	33	7	BEAUTY & SKINCARE
7	JOJI SPA BUBBLE SOAP	9.90	PENANG	0	0	BEAUTY & SKINCARE
8	PACKAGING BARU! WILYA WHITENING SOAP / SABUN	10.90	KELANTAN	0	0	BEAUTY & SKINCARE
9	FLACENTA UV-WHITENING HAND & BODY LOTION	9.90	SELANGOR	14	5	BEAUTY & SKINCARE

Total rows: 80729
Total columns: 6

Category count:

- BEAUTY & SKINCARE: 18080 products - HEALTH & WELLNESS: 16519 products

- STATIONERY: 15505 products

- HOME & LIVING: 10196 products - HOME APPLIANCES: 9757 products - WOMEN'S FASHION: 8441 products

- MOTHER & BABY: 2231 products

Group 2 (Below Average Popularity):

	Product Name	Price	Location	Quantity Sold	Total Reviews	Category
0	20G CHEILITIS CREAM LIP CARE CHEILITIS REPAIR	9.14	CHINA	31	8	BEAUTY & SKINCARE
1	MODELONES GEL NAIL POLISH SET POPULAR NUDE NEU	19.72	CHINA	55	9	BEAUTY & SKINCARE
2	GMEELAN CENTELLA BHA SMOOTHING GEL CLEANSER CE	30.00	SELANGOR	30	12	BEAUTY & SKINCARE
3	HADA LABO AGING CARE FACE WASH 100G	24.97	SELANGOR	33	13	BEAUTY & SKINCARE
4	1KG GOAT MILK SOAP BASE (CONTAIN GLYCERIN) 1	29.90	WP KUALA LUMPUR	38	10	BEAUTY & SKINCARE
5	WHITENING BODY LOTION GLOW SKIN WHITE FOR FULL	26.37	PERAK	26	10	BEAUTY & SKINCARE
6	HANBOLI PEPTIDE EYE ESSENCE STICK SPRING SUMME	11.30	N/A	190	11	BEAUTY & SKINCARE
7	NIVEA WOMEN DEODORANT EXTRA BRIGHT C&E 50ML	9.90	PERAK	30	8	BEAUTY & SKINCARE
8	BEDAK PONDS PINKISH GLOW 100% ORIGINAL - BEST	9.99	PERLIS	74	11	BEAUTY & SKINCARE
9	ASTRAGALUS CREAM FACIAL CLEANSER TRANSPARENT M	12.50	N/A	1800	8	BEAUTY & SKINCARE

Total rows: 7845
Total columns: 6

Category count:

- BEAUTY & SKINCARE: 2205 products

- HEALTH & WELLNESS: 1784 products

- STATIONERY: 1752 products

- HOME APPLIANCES: 864 products
- HOME & LIVING: 791 products

- WOMEN'S FASHION: 408 products

- MOTHER & BABY: 41 products

Group 3 (Above Average Popularity):

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	Product Name	Price	Location	Quantity Sold	Total Reviews	Category
0	SNEFE WHITE LILY HYDRATING CLEANSER 雪玲妃氨基酸洗面奶	12.00	PENANG	47	20	BEAUTY & SKINCARE
1	流磺除螨祛痘洗护套装 QINGLING SULFUR FACIAL CLEANSER +BO	15.50	JOHOR	417	16	BEAUTY & SKINCARE
2	EELHOE HAIR DYE GRAY COLOR FASHION GREY DYE HA	16.50	CHINA	26	20	BEAUTY & SKINCARE
3	CLEAR MEN DEEP CLEANSE ANTI-DANDRUFF SHAMPOO 3	18.04	SELANGOR	246	17	BEAUTY & SKINCARE
4	NIXODERM BIO-SULFUR WITH SALICYLIC ACID LIQUID	25.69	KEDAH	41	20	BEAUTY & SKINCARE
5	LAFRE SANITARY PADS PANTYLINER 155MM 20S LAD	12.50	NEGERI SEMBILAN	126	21	BEAUTY & SKINCARE
6	COSRX LOW PH GOOD MORNING GEL CLEANSER FOR FAC	20.44	SELANGOR	57	18	BEAUTY & SKINCARE
7	[READY STOCK] THE GOAT SKINCARE ORGANIC SOAP C	8.70	PAHANG	89	19	BEAUTY & SKINCARE
8	POND'S SERUM WHIP BRIGHT BEAUTY / PURE BRIGHT	14.50	SELANGOR	59	18	BEAUTY & SKINCARE
9	NIVEA LIP PEARL SHINE 4.8G	15.84	SELANGOR	65	15	BEAUTY & SKINCARE

Total rows: 4653
Total columns: 6

Category count:

- BEAUTY & SKINCARE: 1279 products

- STATIONERY: 1083 products

- HEALTH & WELLNESS: 1031 products

- HOME APPLIANCES: 537 products

- HOME & LIVING: 469 products

- WOMEN'S FASHION: 231 products
- MOTHER & BABY: 23 products

Group 4 (Most popular):

```
Product Name Price
                                                                      Location Quantity Sold Total Reviews
                                                                                                                Category
      0 ARON VITAMIN E MOISTURISING CREAM ENRICHED WIT... 7.88
                                                                        PERLIS
                                                                                       127
                                                                                                    27 BEAUTY & SKINCARE
      1 MILK WHITENING BODY LOTION SUAVE SKIN CARE MOI... 15.94
                                                                    SELANGOR
                                                                                       62
                                                                                                    25 BEAUTY & SKINCARE
           SET JRAGAT 3IN1(SABUN. CREAM MALAM DAN SIANG) 4.99 WP KUALA LUMPUR
                                                                                       264
                                                                                                    27 BEAUTY & SKINCARE
                   ORIGINAL TOMATO SOAP BY BRILLIANT SKIN 8.99 WP KUALA LUMPUR
                                                                                      214
                                                                                                    25 BEAUTY & SKINCARE
      4 MENS FACIAL CLEANSER BLACKHEAD REMOVAL FACIAL ... 24.00
                                                                    SELANGOR
                                                                                       48
                                                                                                    24 BEAUTY & SKINCARE
                     DR RASHEL ALOE VERA FACIAL CLEANSER .. 11.30 WP KUALA LUMPUR
                                                                                       57
                                                                                                    27 BEAUTY & SKINCARE
         DASHING 2 IN 1 MUKA DAN BADAN PEMBERSIH 700G F... 21.50
                                                                                       72
                                                                                                    22 BEAUTY & SKINCARE
                                                                    SELANGOR
      7 150ML NICOR MEN FACIAL CLEANSER ANTI MITE ACNE... 19.98
                                                                       JOHOR
                                                                                      232
                                                                                                    24 BEAUTY & SKINCARE
      8 A BONNE MILK POWER LIGHTENNING LOTION + COLLAG... 22.99
                                                                      MELAKA
                                                                                       72
                                                                                                    22 BEAUTY & SKINCARE
                                   HEALTHY SHOP LIPSTICK 27.00 WP KUALA LUMPUR
                                                                                       126
                                                                                                    22 BEAUTY & SKINCARE
      Total rows: 2783
      Total columns: 6
       Category count:
      - BEAUTY & SKINCARE: 758 products
      - HEALTH & WELLNESS: 636 products
      - STATIONERY: 609 products
      - HOME APPLIANCES: 329 products
      - HOME & LIVING: 287 products
      - WOMEN'S FASHION: 142 products
      - MOTHER & BABY: 22 products
      Total rows processed: 113,596
      Code Execution time: 13.5979 seconds
      Throughput: 8,353.95 rows per second
      Current memory usage: 0.1762 MB
      Peak memory usage: 0.3121 MB
      CPU usage: 19.0%
      Total time for this cell (Including time to display the performance):
      CPU times: user 852 ms, sys: 40.4 ms, total: 893 ms
      Wall time: 14.6 s
       Step 6 : Ranking Location Based on Market Performance
In [ ]: %%time
        tracemalloc.start()
       start_time = time.perf_counter()
       df_location_sales = df_price.groupBy("Location").agg(
           F.sum("Quantity Sold").alias("Total Quantity Sold"),
           F.avg("Price").alias("Average Price")
        df_location_sales = df_location_sales.withColumn(
           "Market Performance",
           F.col("Total Quantity Sold") * F.col("Average Price")
       df_location_sales = df_location_sales.orderBy(F.col("Market Performance").desc())
        display(df_location_sales.limit(10).toPandas())
       print("\n")
        total_rows = df_cleaned.count()
       current, peak = tracemalloc.get_traced_memory()
       end_time = time.perf_counter()
        tracemalloc.stop()
       execution_time = end_time - start_time
       throughput = total_rows / execution_time if execution_time > 0 else 0
       print("\n========\n")
       print(f"Total rows processed: {total_rows:,}")
       print(f"Code Execution time: {execution_time:.4f} seconds")
        print(f"Throughput: {throughput:,.2f} rows per second")
        print(f"Current memory usage: {current / 10**6:.4f} MB")
       print(f"Peak memory usage: {peak / 10**6:.4f} MB")
       cpu_usage = psutil.cpu_percent(interval=1)
       print(f"CPU usage: {cpu_usage}%")
```

print("\nTotal time for this cell (Including time to display the performance):")

	Location	Total Quantity Sold	Average Price	Market Performance
0	SELANGOR	10562173	100.849751	1.065193e+09
1	N/A	18524452	43.647313	8.085426e+08
2	CHINA	6341944	97.622898	6.191190e+08
3	WP KUALA LUMPUR	1227922	101.519881	1.246585e+08
4	JOHOR	1499826	78.073532	1.170967e+08
5	OVERSEAS	2083568	48.480572	1.010126e+08
6	PENANG	962481	100.382696	9.661644e+07
7	PERAK	1029478	80.170026	8.253328e+07
8	HONG KONG	376652	138.300619	5.209120e+07
9	KEDAH	595993	80.050847	4.770974e+07

Total rows processed: 113,596
Code Execution time: 1.8099 seconds
Throughput: 62,763.71 rows per second
Current memory usage: 0.0610 MB
Peak memory usage: 0.1632 MB

CPU usage: 56.9%

Total time for this cell (Including time to display the performance):

CPU times: user 148 ms, sys: 5.9 ms, total: 154 ms

Wall time: 2.82 s

End of Part 2 Data Optimization