

Product Creation Data Analyst Intern

Case Study Results

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01

Anomaly detection

Find and handle anomalies in the data

Data set overview

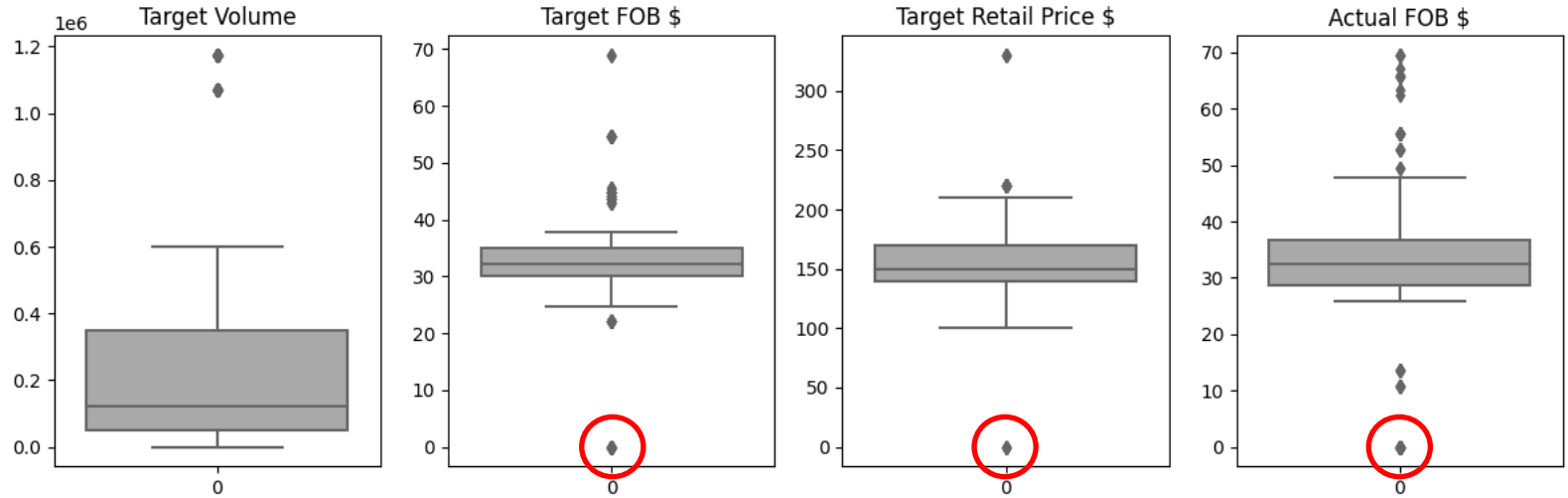
Data columns (total 18 columns):

| # | Column | Non-Null Count | Dtype |
|----|------------------------|----------------|---------|
| 0 | Season | 933 non-null | object |
| 1 | Gender | 933 non-null | object |
| 2 | Style Name | 933 non-null | object |
| 3 | Unique ID | 933 non-null | object |
| 4 | Target Volume | 933 non-null | int64 |
| 5 | Target FOB \$ | 933 non-null | float64 |
| 6 | Target Retail Price \$ | 933 non-null | int64 |
| 7 | Style Update | 911 non-null | object |
| 8 | Vertical | 933 non-null | object |
| 9 | Color Update | 932 non-null | object |
| 10 | Factory | 933 non-null | object |
| 11 | UPPER Cost | 933 non-null | float64 |
| 12 | Other Cost | 933 non-null | float64 |
| 13 | BOTTOM Cost | 933 non-null | float64 |
| 14 | LABOR Cost | 933 non-null | float64 |
| 15 | OVERHEAD Cost | 933 non-null | float64 |
| 16 | Tooling Cost | 933 non-null | float64 |
| 17 | Actual FOB \$ | 933 non-null | float64 |

Data set properties

- 18 dimensions
- Categorical and numerical data
- Some columns have null values

Quantitative data distribution



Anomaly analysis findings

Target volume

- There are some large values, but this might indicate that some shoes are sold in high volume.

Target FOB \$

- Some values are large (the Target FOB \$ is 68.9), but it's not necessarily an anomaly, since it's likely that it is a premium (Cloud Maxi)
- The 22.1 value is from a Kid's shoe so it's not an outlier
- There are some 0 values in this column, although there shouldn't be any 0 values in this column

Actual FOB \$

- It seems odd that a lot of the values are higher than the target values. This might indicate that the costs are higher than expected.
- There are some 0 values, which is not possible (no shoes can be produced for free)
- Some odd values come from the Cloud Amazing shoe (Man/Women) where there are only Other Costs which is strange
 - But most of the time it's a Carry Over, which might introduce fewer costs
 - And for each of these shoes there is a corresponding shoe that has "regular values"
 - All of these outliers come from the same factory (factory 2) which might give a hint as to why the behaviour exists

Target Retail Price \$

- Some values are large (target retail price is 330), but it's not an anomaly, since it's likely that it is a premium shoe (Cloud Maxi)
- There are some 0 values, where there shouldn't be any

Consequences

- Removal of all data points where the following columns have 0 values
 - Target FOB \$
 - Target Retail Price \$
 - Actual FOB \$
- Categorical "None" values can be handled by the group by functions that are being used in the analysis, therefore these data points are kept in the data set



Number of data points before anomaly removal: 933

Number of data points after anomaly removal: 872

01

Cost analysis

Break down by vertical and factory

| | UPPER Cost | Other Cost | BOTTOM Cost | LABOR Cost | OVERHEAD Cost | Tooling Cost | Actual FOB \$ |
|-----------|------------|------------|-------------|------------|---------------|--------------|---------------|
| Factory | | | | | | | |
| Factory 1 | 8.75 | 5.60 | 8.43 | 5.92 | 4.53 | 0.04 | 33.27 |
| Factory 2 | 7.56 | 5.26 | 8.15 | 6.21 | 5.67 | 0.18 | 33.03 |
| Factory 3 | 9.71 | 7.41 | 7.63 | 4.16 | 3.44 | 0.01 | 32.35 |
| Factory 4 | 9.34 | 4.69 | 8.48 | 5.30 | 4.59 | 0.22 | 32.62 |
| Factory 5 | 14.40 | 7.09 | 9.45 | 5.11 | 4.06 | 0.02 | 40.12 |

Factory break down

| | UPPER Cost | Other Cost | BOTTOM Cost | LABOR Cost | OVERHEAD Cost | Tooling Cost | Actual FOB \$ |
|---------------------|------------|------------|-------------|------------|---------------|--------------|---------------|
| Vertical | | | | | | | |
| Performance All Day | 8.99 | 5.50 | 7.90 | 5.26 | 4.44 | 0.11 | 32.19 |
| Performance Outdoor | 16.19 | 7.64 | 11.61 | 6.24 | 3.80 | 0.05 | 45.53 |
| Performance Running | 9.74 | 5.95 | 8.66 | 5.33 | 4.46 | 0.06 | 34.20 |

Vertical break down

Other information to understand costs

The cost breakdown already tells a lot how much it costs to produce a specific product and makes it easy to compare the costs between different products. However, in my opinion there could be additional costs that could have an impact on the results of the analysis:

- Material Cost: Additional costs to the upper and bottom part of the shoe, like laces or materials for the shoes
- Packing Costs: All the costs associated with packing of the sneakers to present and protect the product (May include items such as boxes, labels etc.).
- Shipping costs: Costs that account for the transportation and logistics expenses to move the products from the factories to the destination. This might include freight charges or custom duties
- Marketing costs: These are expenses that are related to the promotion and advertising of a product. It may include costs for campaigns, influencers or other marketing activities
- Warranty: Some sneaker might break easier than other and may introduce additional costs to replace the product.

Some of these costs might be included in the Other Costs column, in that case it would be helpful if there would be a more specific break down of this column

02

Margin analysis

Target and actual margin

Margin analysis for different On products

Click on the link above the get the results

Lowest and highest margin

| | Style Name | Target Margin per Piece | Actual Margin per Piece | Lowest and highest margin |
|---------|-------------|-------------------------|-------------------------|---------------------------|
| Highest | Cloud Maxi | 261.10 | 263.50 | |
| Lowest | Cloudinsane | 77.90 | 74.11 | |

| | Style Name | Target Margin | Actual Margin | Lowest and highest margin taking target volume into account |
|---------|---------------|---------------|---------------|---|
| Highest | Cloudinfinity | 120712001.19 | 120079403.88 | |
| Lowest | Superclouds | 939233.33 | 924275.67 | |

Season SS23 margin break down

| | Style Name | Target Margin per Piece | Actual Margin per Piece | Lowest and highest margin |
|---------|-------------|-------------------------|-------------------------|---------------------------|
| Highest | Cloud Maxi | 261.10 | 263.50 | |
| Lowest | Cloudinsane | 77.90 | 74.11 | |

| | Style Name | Target Margin | Actual Margin | Lowest and highest margin taking target volume into account |
|---------|---------------|---------------|---------------|---|
| Highest | Cloudinfinity | 120593212.42 | 119739354.39 | |
| Lowest | Superclouds | 940475.00 | 922213.50 | |

Season FW23 margin break down

| | Target Margin per Piece | Actual Margin per Piece | |
|--------------------|-------------------------|-------------------------|---------------------------|
| Style Name | | | Lowest and highest margin |
| Highest Cloud Maxi | 261.10 | 266.53 | |
| Lowest Cloudcrazy | 85.30 | 82.93 | |

| | Target Margin | Actual Margin | |
|-----------------------|---------------|---------------|---|
| Style Name | | | Lowest and highest margin taking target volume into account |
| Highest Cloudinfinity | 120819990.97 | 120388539.79 | |
| Lowest Superclouds | 936750.00 | 928400.00 | |

03

Implications

Putting the results into context

Steps to increase the margin

1)

| | Target Margin Per Piece | Actual Margin Per Piece |
|--------|-------------------------|-------------------------|
| Gender | | |
| Kids | 80.366667 | 76.720000 |
| Men | 123.768637 | 122.394361 |
| Women | 122.263342 | 121.919595 |
| Youth | 88.227273 | 85.304545 |

When you look at the margin Women's and Men's shoes have the highest margin. The costs however are similar to the other gender values (Kids, Youth). Therefore On could focus more on the Men's and Women's shoes section and reduce the Kids and Youth section products or raise the price in those two sections.

2)

| | UPPER Cost | Other Cost | BOTTOM Cost | LABOR Cost | OVERHEAD Cost | Tooling Cost | Actual FOB \$ |
|-----------|------------|------------|-------------|------------|---------------|--------------|---------------|
| Factory | | | | | | | |
| Factory 1 | 8.745017 | 5.604742 | 8.433814 | 5.924605 | 4.530137 | 0.038041 | 33.274089 |
| Factory 2 | 7.558571 | 5.260952 | 8.148889 | 6.211429 | 5.668889 | 0.181429 | 33.029048 |
| Factory 3 | 9.707820 | 7.413008 | 7.626466 | 4.162180 | 3.435263 | 0.006767 | 32.350752 |
| Factory 4 | 9.343373 | 4.688675 | 8.483655 | 5.297992 | 4.594016 | 0.217229 | 32.622329 |
| Factory 5 | 14.400588 | 7.089706 | 9.451250 | 5.108309 | 4.057868 | 0.016103 | 40.121544 |

| | Target Margin Per Piece | Actual Margin Per Piece |
|-----------|-------------------------|-------------------------|
| Factory | | |
| Factory 1 | 119.383488 | 118.237938 |
| Factory 2 | 132.291111 | 135.542381 |
| Factory 3 | 117.472331 | 116.972556 |
| Factory 4 | 118.006494 | 116.735100 |
| Factory 5 | 134.834625 | 132.451985 |

Factory 2 but also high margins, which might indicate that more products should be produced at this factory, This tells us that at this factory shoes with high margin can be produced with low costs.

Steps to increase the margin

3)

| | Target Margin Per Piece | Actual Margin Per Piece |
|---------------------|-------------------------|-------------------------|
| Vertical | | |
| Performance All Day | 117.174304 | 116.812734 |
| Performance Outdoor | 141.230130 | 137.327922 |
| Performance Running | 125.966912 | 124.694706 |

Since Outdoor shoes can be sold with higher margins, On could consider to more extend this branch of it's shoes

Other relevant overview to understand the business

| | Target Margin Per Piece | Actual Margin Per Piece |
|-------------------|-------------------------|-------------------------|
| Style Update | | |
| CO - Carry Over | 121.513034 | 120.528162 |
| NM - New Material | 125.680000 | 128.317500 |
| NU - New Upper | 124.575417 | 124.875000 |
| TN - Totally New | 125.827179 | 123.670385 |

When you look more closely at the different style updates it seems odd that 'Carry Over' introduces higher average costs than New Material (Actual FOB \$). Also intuitively you would expect – since the costs are lower – that the margin would be higher for the 'Carry Over' style update.

| | UPPER Cost | Other Cost | BOTTOM Cost | LABOR Cost | OVERHEAD Cost | Tooling Cost | Actual FOB \$ |
|-------------------|------------|------------|-------------|------------|---------------|--------------|---------------|
| Style Update | | | | | | | |
| CO - Carry Over | 9.596405 | 5.997595 | 8.410311 | 5.376635 | 4.410500 | 0.087932 | 33.877243 |
| NM - New Material | 8.400000 | 5.102500 | 7.822500 | 5.965000 | 4.370000 | 0.020000 | 31.682500 |
| NU - New Upper | 11.749583 | 4.320000 | 8.326250 | 5.588750 | 4.636250 | 0.087917 | 34.708333 |
| TN - Totally New | 12.279231 | 4.672436 | 9.439872 | 5.153590 | 4.182051 | 0.091538 | 35.816795 |
| NaN | 8.581818 | 6.039091 | 7.154091 | 5.470000 | 4.176364 | 0.236364 | 31.654545 |

04

KPI's

Understand performance using with KPI's

On KPI's to track performance

To better track the performance of the product creation team I propose the following three KPIs:

- Actual Volume: With this KPI the actual number of units sold could be measured. This would give the information how much a shoe in a specific season and gender category is sold. It also provides insights into the popularity and demand for different styles among customers. By comparing the actual volume to the target volume, the management can also assess the performance and success of their sales efforts.
- Variance of costs (Actual FOB): This can be used to track the variance between the actual FOB and the target FOB for each product. It can be calculated by subtracting the Target FOB from the Actual FOB for each product. This KPI provides insights into the accuracy of cost estimations and can help identify potential areas for improvement in cost forecasting and negotiation with suppliers.
- Return on Investment (ROI): ROI measures the return or profit generated relative to the investment made. In the context of this data set, the ROI could be calculated by comparing the revenue generated by each style against (which would be the retail price times the actual volume) the associated investment in terms of production costs and marketing expenses. It could help assess the financial performance and effectiveness of resource allocation.

Tool

Select your product branch

- Select your product branch
- ☒ Performance Running
 - ☐ Performance Outdoor
 - ☐ Performance All Day

Product Analysis

This tool is designed to help you analyze the impact of Target FOBs (Free on Board) and Retail Prices on the margins of On's products. The tool is divided into three tabs: Performance Running, Performance Outdoor and Performance All Day. Each tab contains a histogram plot, that shows the distribution of the margins of the different products in the respective category. The sliders allow you to increase the Target FOB and Retail Price by a certain percentage. In the second section a specific On product can be selected and the absolute Price and FOB can be adjusted.



Section 1: Histogram Plot

Adjust relative values



Section 2: Product Margin

Adjust absolute values

Select a Product

Cloud Fly

Current Retail Price: 150.0

Current FOB: 33.0

Current Margin: 117.0

[Click here to access the code and the tool](#)



Thank You

If there are any questions, please feel free to ask:
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