

C&T Case Study

Portfolio Allocation - Business Case

Dataset

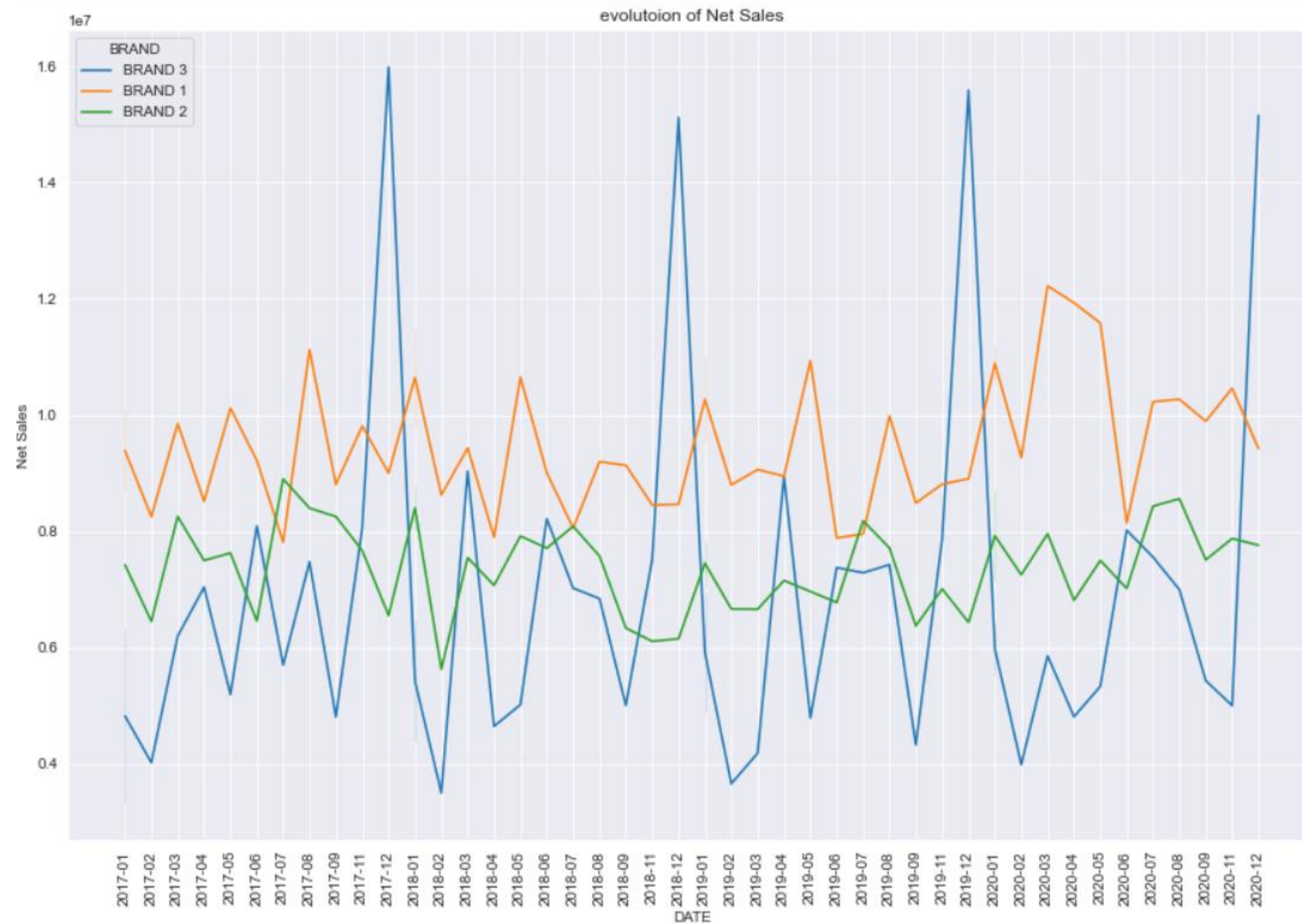
Financial Data

$A \& P = A + P$

| Products | Year | Net Sales | Advertising Spend (A) | Promotion Spend (P) |
|----------|---------|--------------|-----------------------|---------------------|
| Brand 3 | 2017.01 | € 3,324,572 | € 141,943 | € 70,620 |
| Brand 1 | 2017.01 | € 8,692,541 | € 118,484 | € 122,556 |
| Brand 2 | 2017.01 | € 7,409,735 | € 158,771 | € 134,664 |
| Brand 3 | 2017.02 | € 4,018,024 | € 191,410 | € 105,656 |
| Brand 1 | 2017.02 | € 8,248,312 | € 347,991 | € 160,665 |
| Brand 2 | 2017.02 | € 6,450,413 | € 1,719 | € 163,588 |
| Brand 3 | 2017.03 | € 6,195,464 | € 191,640 | € 71,928 |
| Brand 1 | 2017.03 | € 9,853,953 | € 177,934 | € 189,566 |
| Brand 2 | 2017.03 | € 8,252,658 | € 692,746 | € 72,124 |
| Brand 3 | 2017.04 | € 7,037,240 | € 529,394 | € 59,240 |
| Brand 1 | 2017.04 | € 8,514,623 | € 289,726 | € 160,454 |
| Brand 2 | 2017.04 | € 7,496,722 | € 156,827 | € 85,208 |
| Brand 3 | 2017.05 | € 5,191,971 | € 43,973 | € 205,990 |
| Brand 1 | 2017.05 | € 10,116,737 | € 505,794 | € 170,534 |
| Brand 2 | 2017.05 | € 7,624,827 | € 39,820 | € 169,820 |
| Brand 3 | 2017.06 | € 8,089,022 | € 848,445 | € 211,139 |
| Brand 1 | 2017.06 | € 9,220,545 | € 233,246 | € 231,202 |
| Brand 2 | 2017.06 | € 6,456,173 | € 160,262 | € 151,751 |
| Brand 3 | 2017.07 | € 5,696,744 | € 171,424 | € 127,890 |
| Brand 1 | 2017.07 | € 7,809,208 | € 37,082 | € 135,590 |
| Brand 2 | 2017.07 | € 8,898,625 | € 613,589 | € 110,027 |
| Brand 3 | 2017.08 | € 7,473,700 | € 125,228 | € 54,610 |
| Brand 1 | 2017.08 | € 11,123,532 | € 310,344 | € 122,548 |
| Brand 2 | 2017.08 | € 8,396,893 | € 254,932 | € 97,919 |

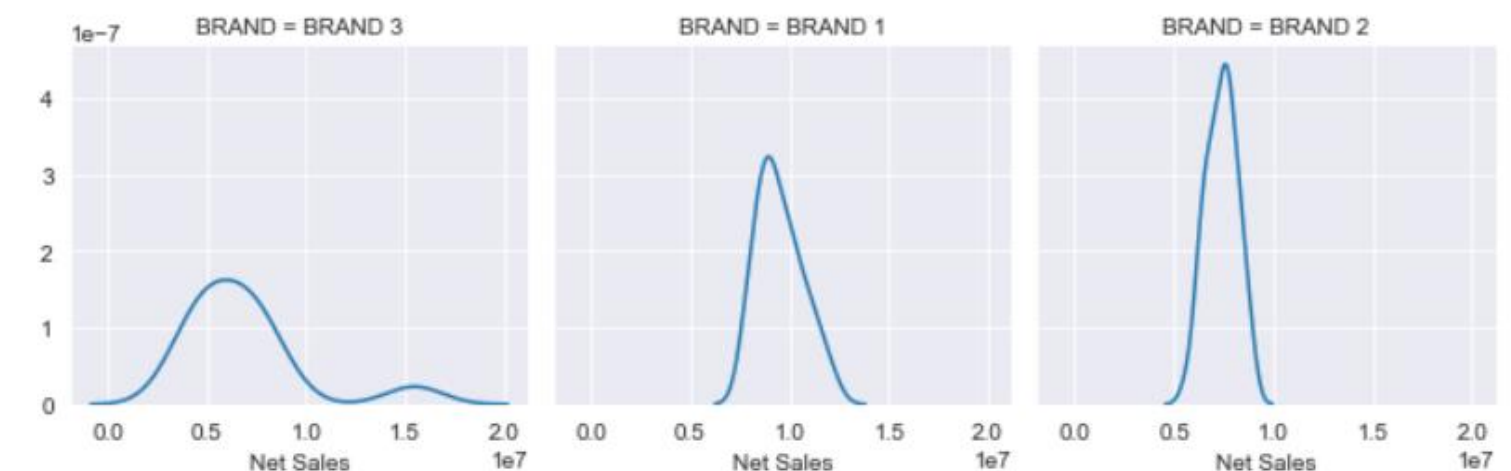
Marketing data

| BRAND | DATE | RATE OF INNOVATION | PRICE PER VOLUME | TDP | SHARE OF VOICE | NET SALES OF COMPETITOR #1 | NET SALES OF COMPETITOR #2 | PRICE PER VOLUME COMPETITOR #1 | MARKET SIZE - SUB MARKET 1 |
|---------|----------|--------------------|------------------|-------------|----------------|----------------------------|----------------------------|--------------------------------|----------------------------|
| BRAND 1 | Mar-2018 | 1.408282476 | € 8.32 | 110.0115419 | 45.192 | € 4,032,382 | € 269,147,223 | € 15 | € 4,390,130 |
| BRAND 1 | Apr-2018 | 1.396744219 | € 8.91 | 109.830905 | 63.484 | € 5,264,635 | € 326,998,896 | € 15 | € 5,774,614 |
| BRAND 1 | May-2018 | 1.731031718 | € 9.25 | 109.8547794 | 55.952 | € 4,339,679 | € 258,334,093 | € 16 | € 4,933,605 |
| BRAND 1 | Jun-2018 | 1.735802287 | € 9.06 | 109.9043085 | 32.28 | € 4,651,524 | € 254,630,304 | € 16 | € 4,559,039 |
| BRAND 1 | Jul-2018 | 1.509909151 | € 9.18 | 109.8896009 | 37.66 | € 5,723,941 | € 315,249,204 | € 15 | € 5,336,451 |
| BRAND 1 | Aug-2018 | 1.46833365 | € 9.18 | 109.9251661 | 50.572 | € 4,624,968 | € 258,636,353 | € 15 | € 4,088,218 |
| BRAND 1 | Sep-2018 | 1.687874797 | € 9.16 | 110.0144234 | 55.952 | € 5,161,005 | € 338,500,890 | € 15 | € 5,549,806 |
| BRAND 1 | Oct-2018 | 1.592928664 | € 8.95 | 110.0350496 | 43.04 | € 4,264,099 | € 293,862,340 | € 14 | € 4,300,455 |
| BRAND 1 | Nov-2018 | 1.404413303 | € 9.03 | 110.0680284 | 51.648 | € 4,048,102 | € 305,516,550 | € 14 | € 4,187,101 |
| BRAND 1 | Dec-2018 | 1.254668124 | € 9.19 | 110.0392376 | 64.56 | € 6,601,889 | € 367,005,850 | € 15 | € 4,900,989 |
| BRAND 1 | Jan-2019 | 1.61485006 | € 8.82 | 109.9568093 | 29.052 | € 4,474,340 | € 280,184,982 | € 15 | € 4,132,439 |
| BRAND 1 | Feb-2019 | 1.454100804 | € 9.08 | 109.8089964 | 50.572 | € 4,252,534 | € 286,531,961 | € 15 | € 4,230,109 |
| BRAND 1 | Mar-2019 | 1.567676327 | € 9.01 | 109.9888764 | 69.94 | € 5,390,723 | € 352,616,435 | € 15 | € 5,510,941 |
| BRAND 1 | Apr-2019 | 1.485176971 | € 9.11 | 109.9975131 | 32.28 | € 4,472,898 | € 271,865,446 | € 15 | € 4,294,235 |
| BRAND 1 | May-2019 | 1.808853511 | € 8.99 | 110.1222835 | 41.964 | € 4,747,135 | € 284,076,550 | € 15 | € 4,753,118 |
| BRAND 1 | Jun-2019 | 1.489030749 | € 9.24 | 110.1225787 | 41.964 | € 6,382,865 | € 343,014,517 | € 15 | € 5,494,650 |
| BRAND 1 | Jul-2019 | 1.498547013 | € 9.27 | 110.1301916 | 50.572 | € 4,988,701 | € 268,759,199 | € 15 | € 4,017,583 |
| BRAND 1 | Aug-2019 | 1.456649351 | € 9.25 | 110.1536272 | 34.432 | € 5,057,037 | € 275,990,158 | € 15 | € 3,983,493 |
| BRAND 1 | Sep-2019 | 1.621679478 | € 9.16 | 110.2011924 | 47.344 | € 5,616,460 | € 355,823,865 | € 15 | € 5,326,453 |
| BRAND 1 | Oct-2019 | 1.58872031 | € 9.04 | 110.179803 | 41.964 | € 4,339,254 | € 302,463,468 | € 15 | € 3,984,972 |
| BRAND 1 | Nov-2019 | 1.405355888 | € 9.21 | 110.156999 | 44.116 | € 4,531,985 | € 316,749,815 | € 15 | € 4,050,275 |
| BRAND 1 | Dec-2019 | 1.330823828 | € 9.24 | 110.1427317 | 60.256 | € 7,303,836 | € 370,681,061 | € 16 | € 4,662,833 |
| BRAND 1 | Jan-2020 | 1.688837106 | € 8.86 | 110.1553163 | 22.596 | € 5,168,073 | € 289,099,905 | € 15 | € 4,023,739 |
| BRAND 1 | Feb-2020 | 1.621987831 | € 9.02 | 110.1800134 | 58.104 | € 4,760,059 | € 291,851,609 | € 15 | € 4,219,246 |
| BRAND 1 | Mar-2020 | 1.802704136 | € 8.99 | 109.6761974 | 61.332 | € 6,254,651 | € 427,549,328 | € 15 | € 5,911,071 |
| BRAND 1 | Apr-2020 | 1.797204193 | € 8.89 | 109.8716867 | 55.952 | € 5,140,774 | € 341,538,803 | € 15 | € 4,488,669 |
| BRAND 1 | May-2020 | 1.776701727 | € 8.88 | 110.1230062 | 50.572 | € 6,494,290 | € 399,824,008 | € 15 | € 5,633,505 |
| BRAND 1 | Jun-2020 | 1.486628434 | € 8.98 | 110.019219 | 51.648 | € 5,104,949 | € 294,495,644 | € 15 | € 4,184,780 |
| BRAND 1 | Jul-2020 | 1.565380994 | € 8.99 | 110.1254969 | 43.04 | € 5,155,827 | € 284,206,018 | € 15 | € 3,930,409 |
| BRAND 1 | Aug-2020 | 1.558898235 | € 8.94 | 110.1607779 | 78.548 | € 7,016,904 | € 356,992,099 | € 15 | € 4,939,757 |
| BRAND 1 | Sep-2020 | 1.622789588 | € 8.98 | 110.1724844 | 53.8 | € 4,719,273 | € 293,321,361 | € 15 | € 4,006,049 |
| BRAND 1 | Oct-2020 | 1.590910703 | € 8.94 | 110.2269138 | 75.32 | € 5,074,395 | € 321,298,258 | € 15 | € 4,011,377 |

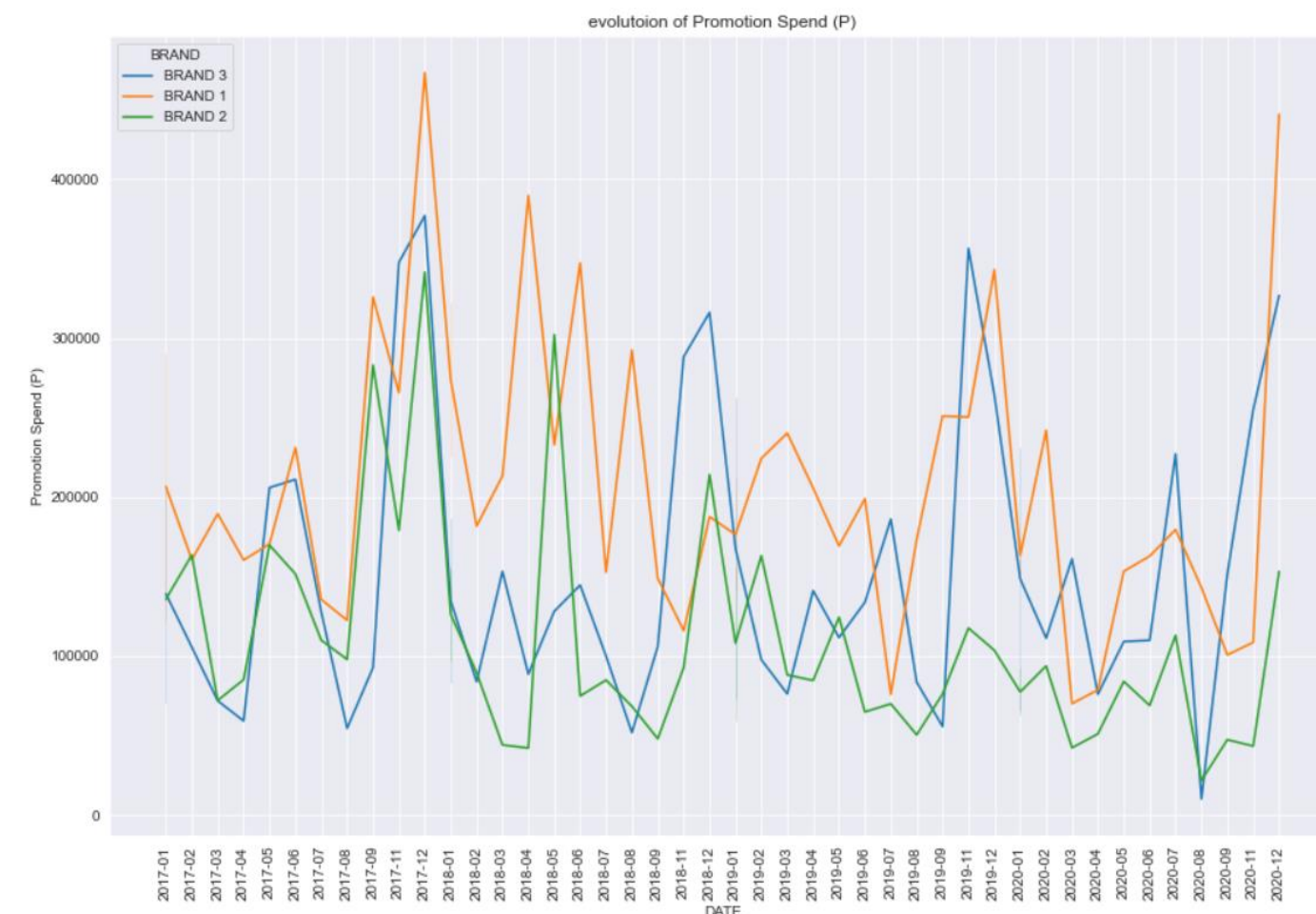
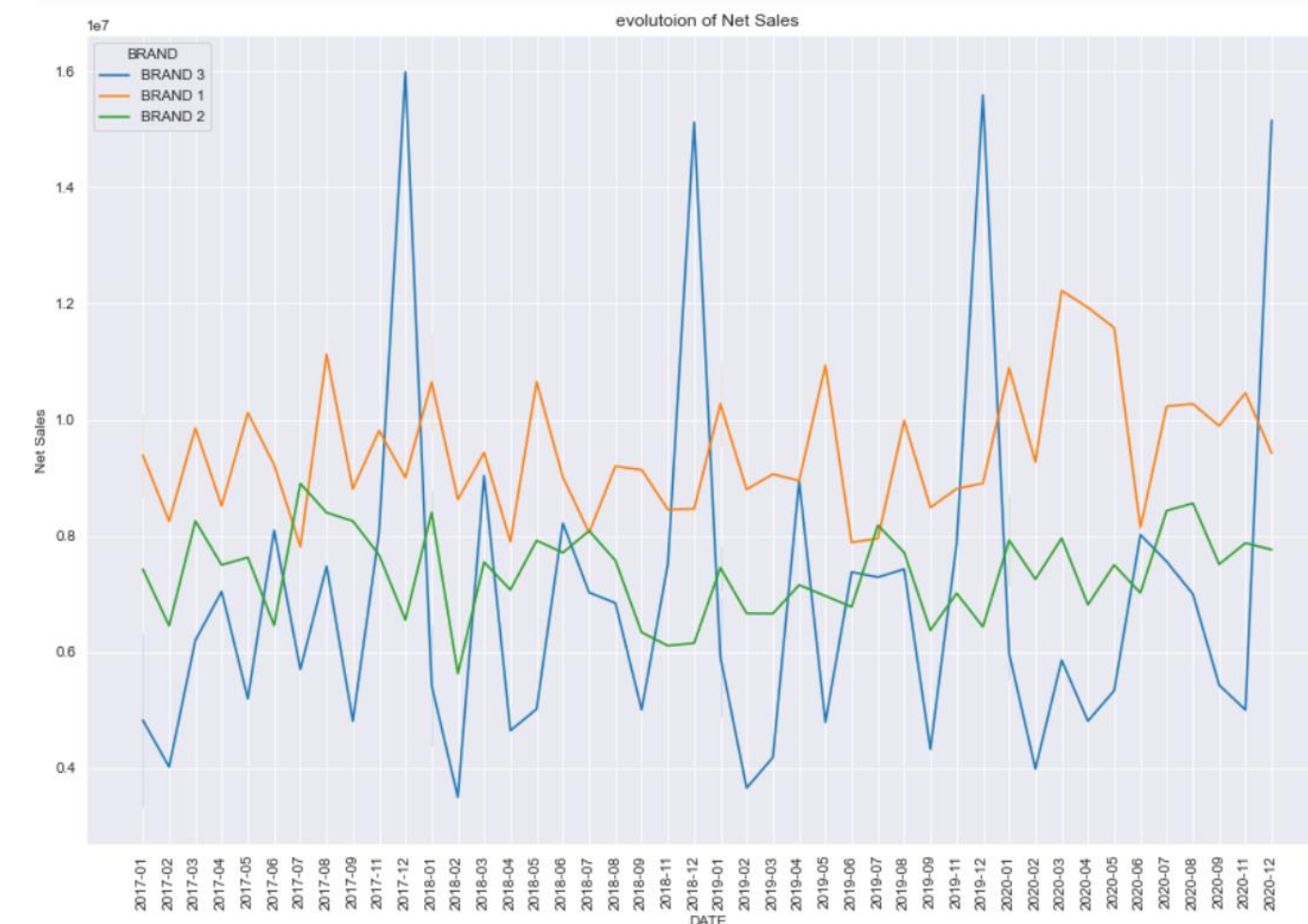


Sales Evolution

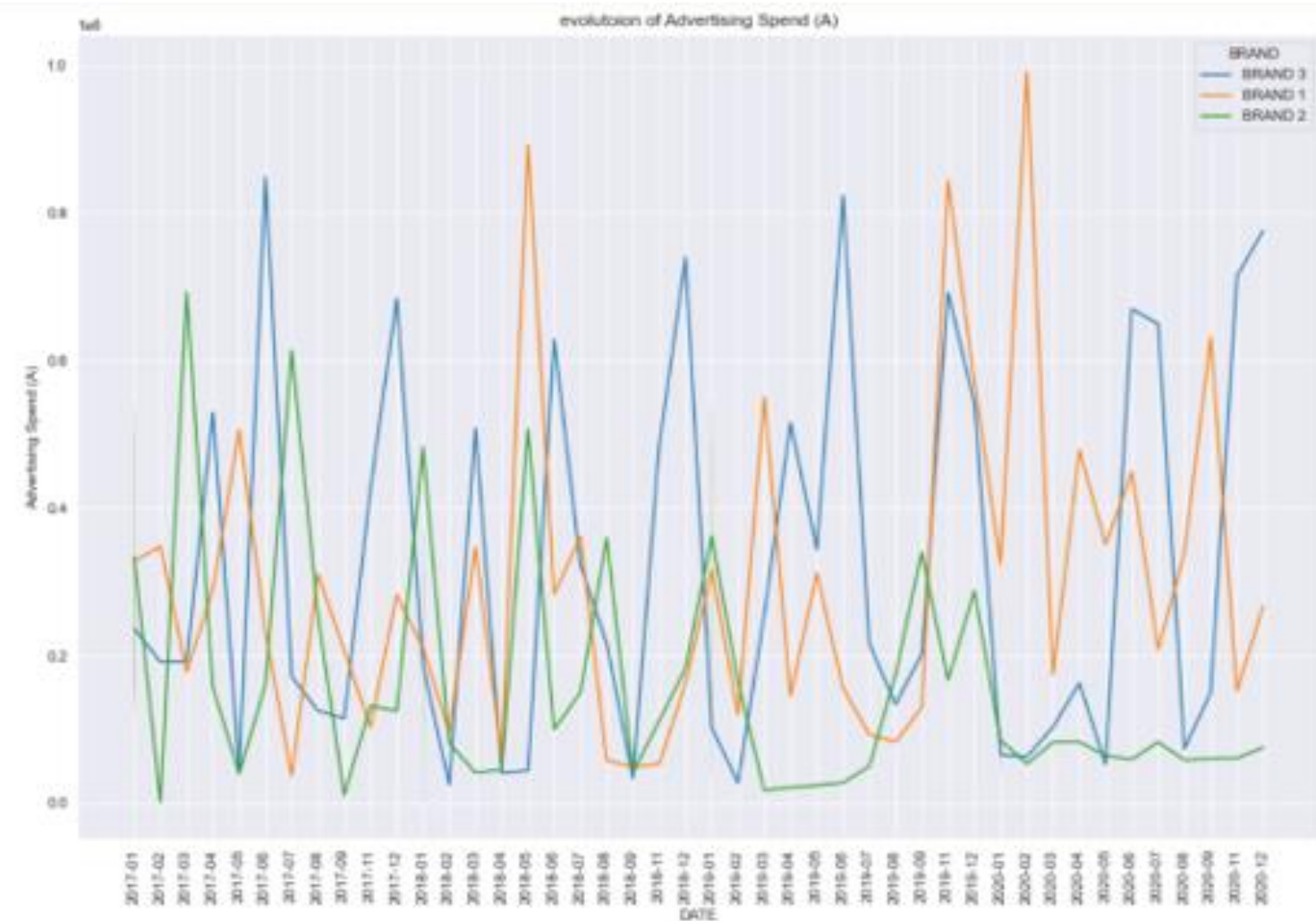
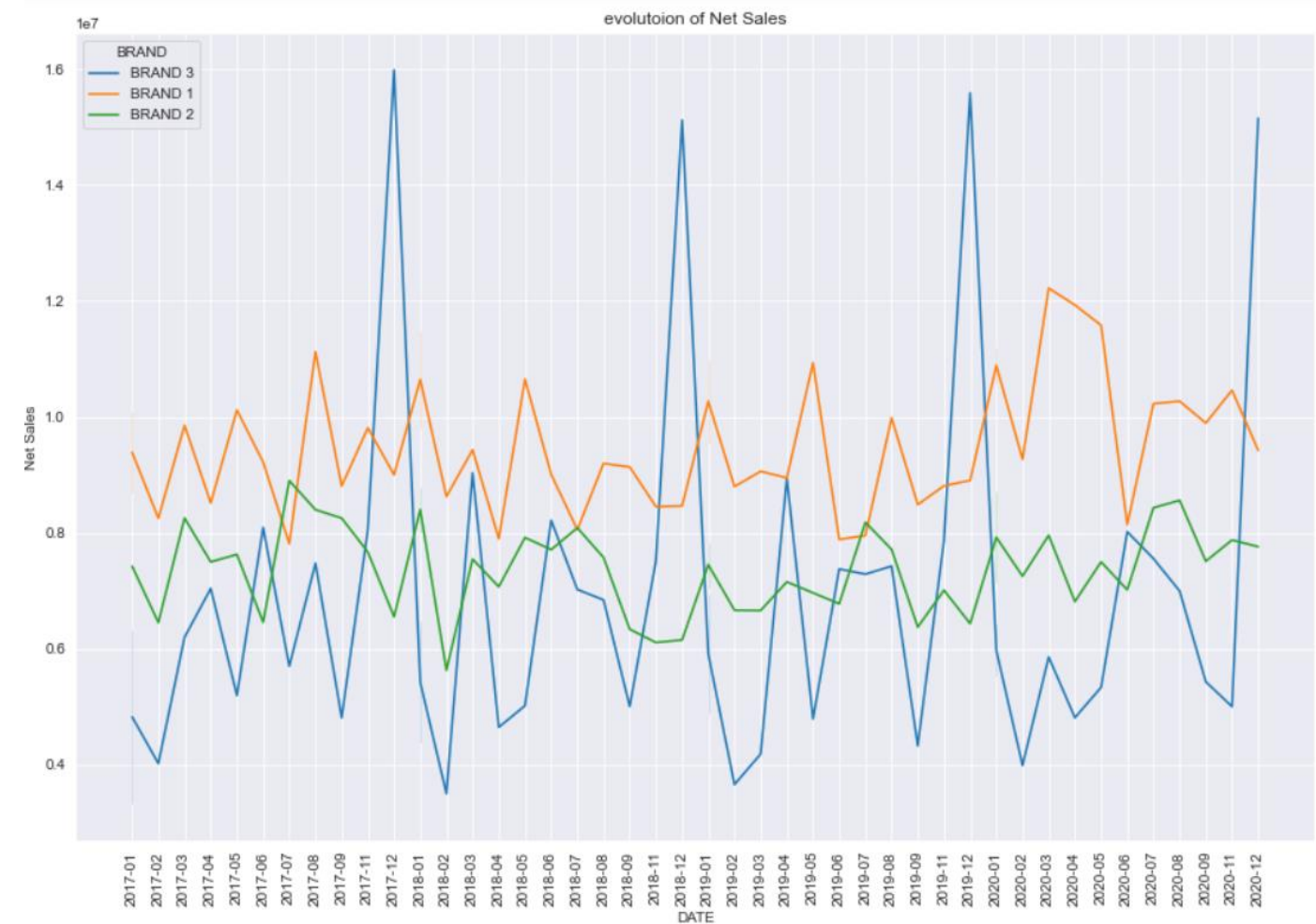
Sales Distribution



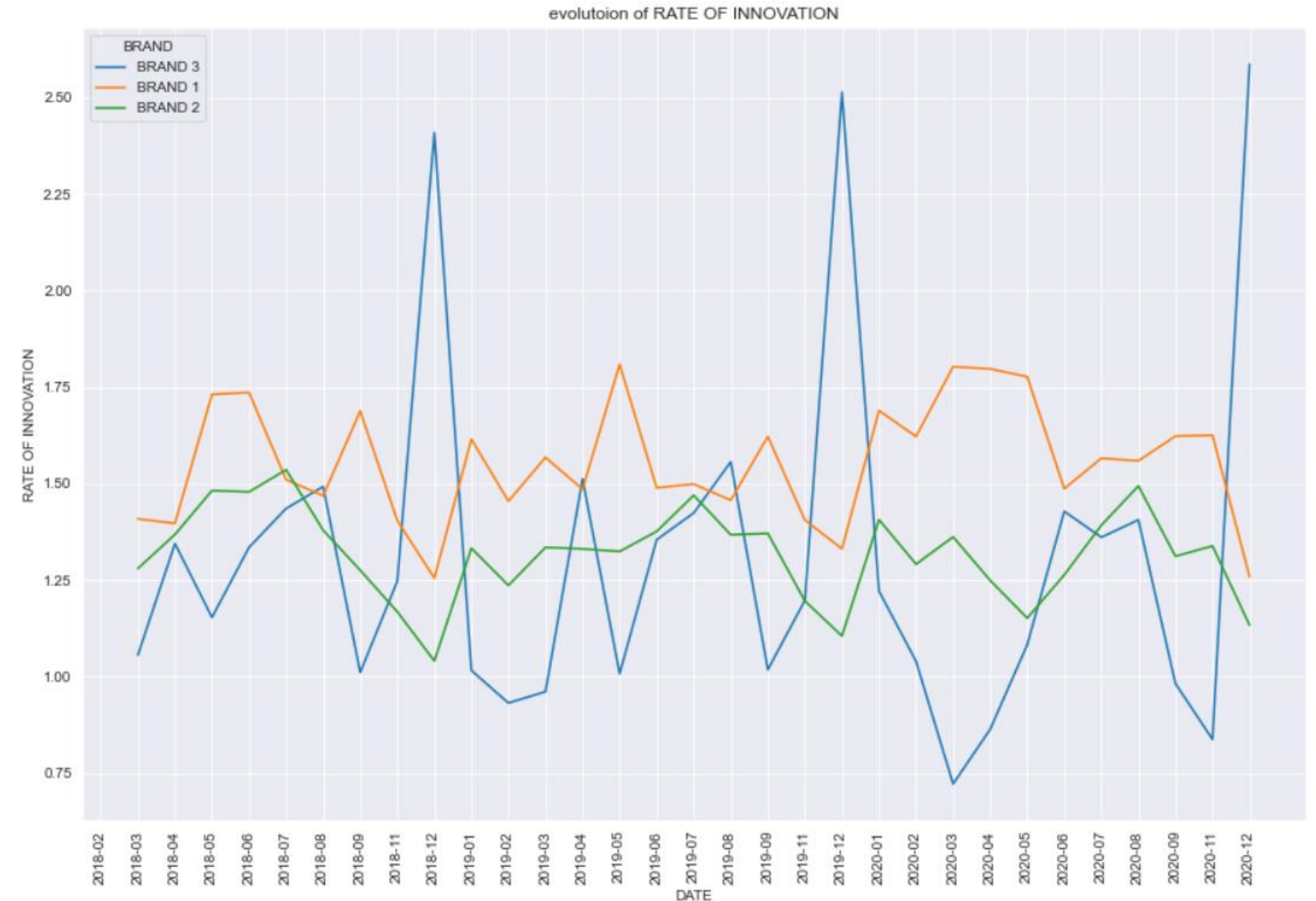
Sales & Promotion Spend



Sales & Advertising Spend



Sales & RATE OF INNOVATION



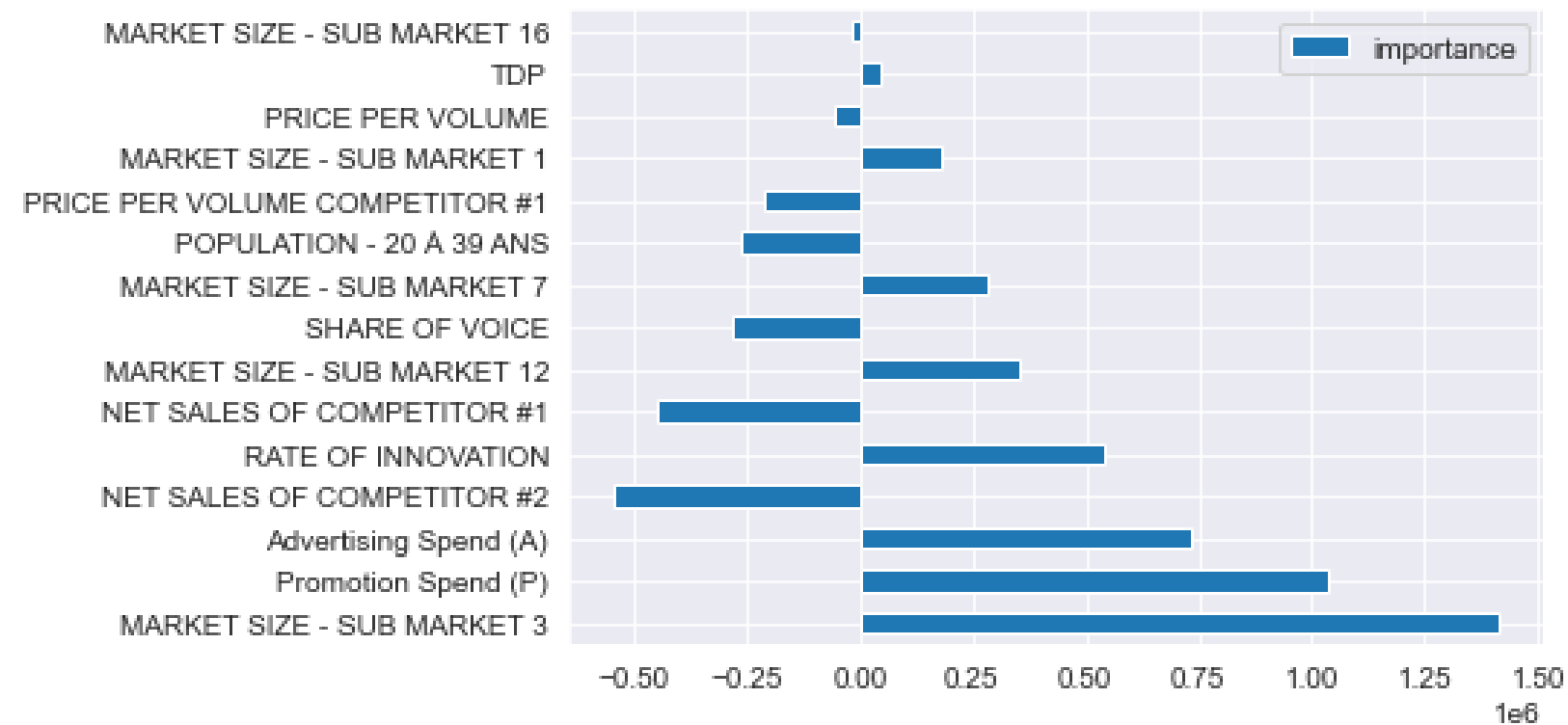
For Brand3 :

- ☐ Sales and Rate of innovation are correlated
- ☐ Peak in November and December

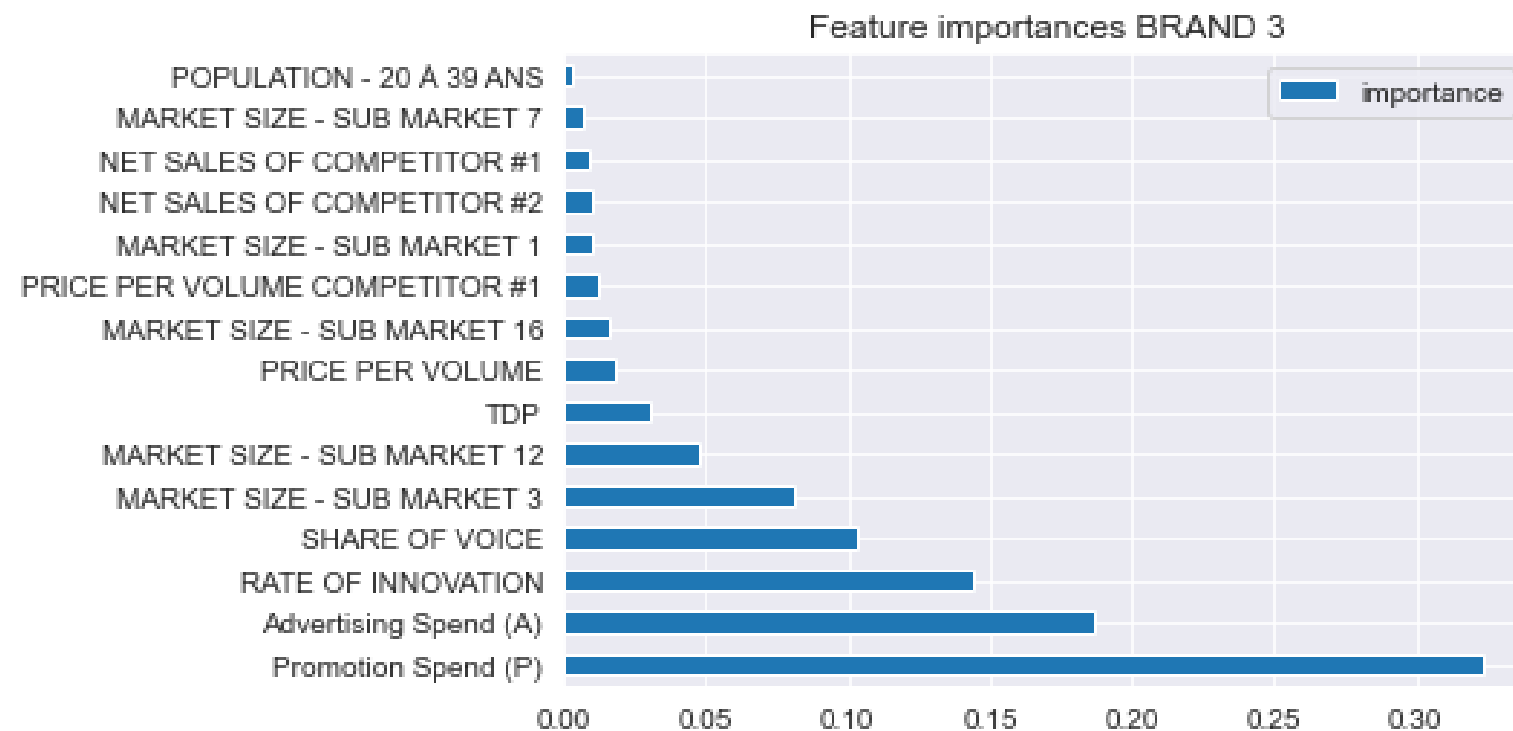
Correlation Matrix

- Some highly correlated data: need to be removed

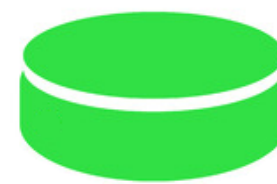
Feature Selection



Lasso

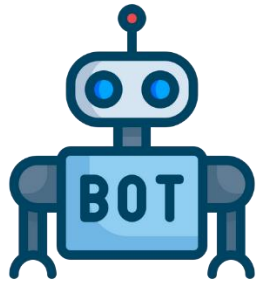
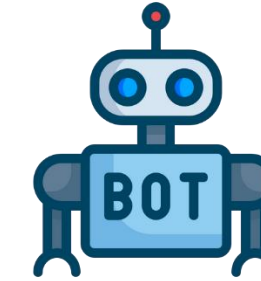
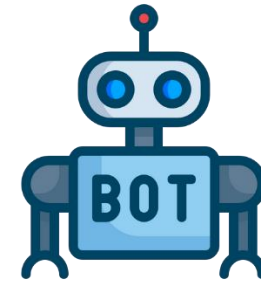


Random Forest



Validation dataset

Model for each brand



Net Sales

Net Sales

Net Sales

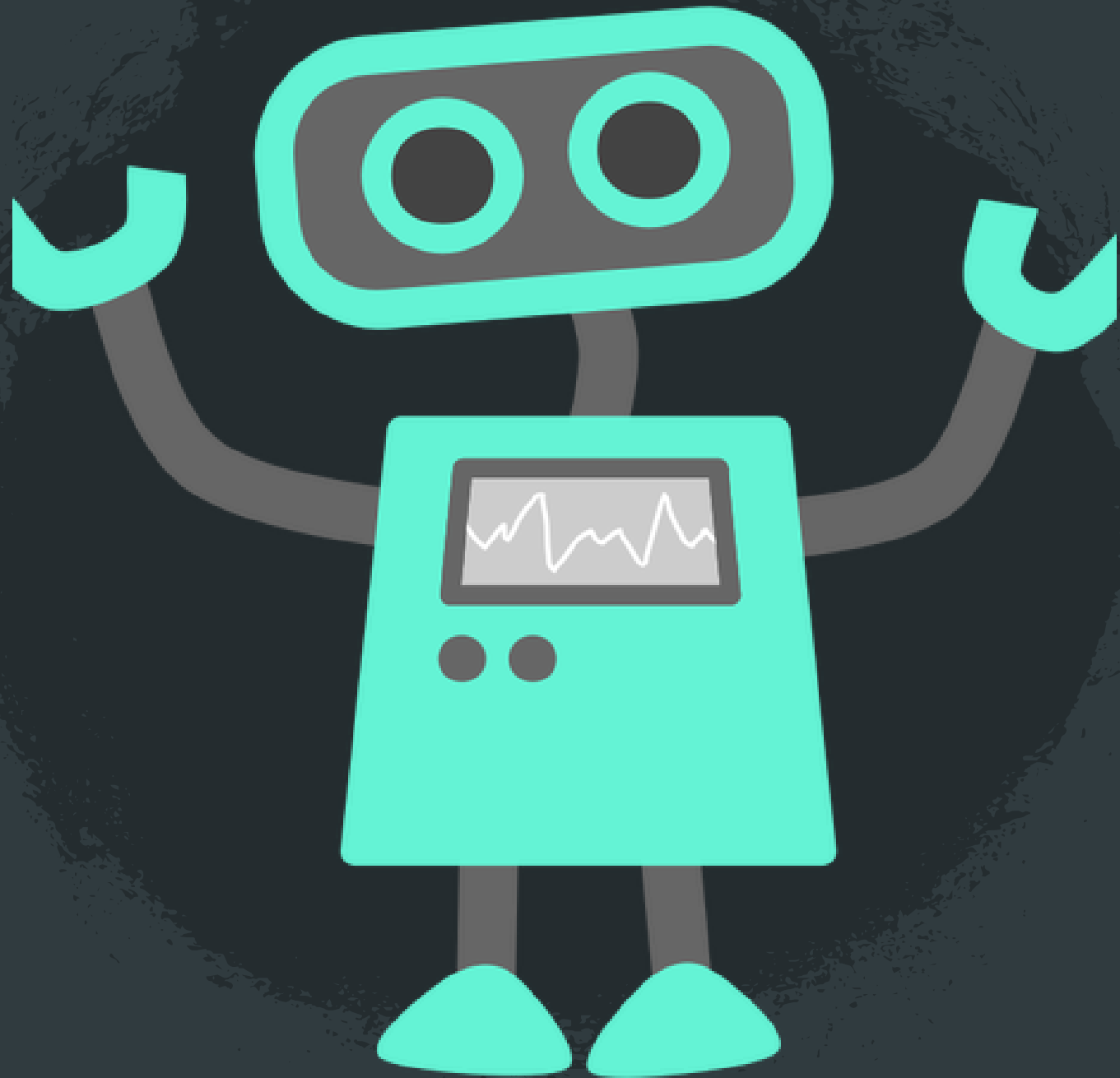
A&P

A&P

A&P

Training dataset

Model for Net Sales



2 Approaches

- Linear regression per brand
- Xgboost regressor per brand

Results

Brand 1

| | MAPE | RMSE |
|---------|--------|------------|
| Linear | 0.1010 | 1025374.66 |
| Xgboost | 0.1042 | 1112335.61 |

Brand 2

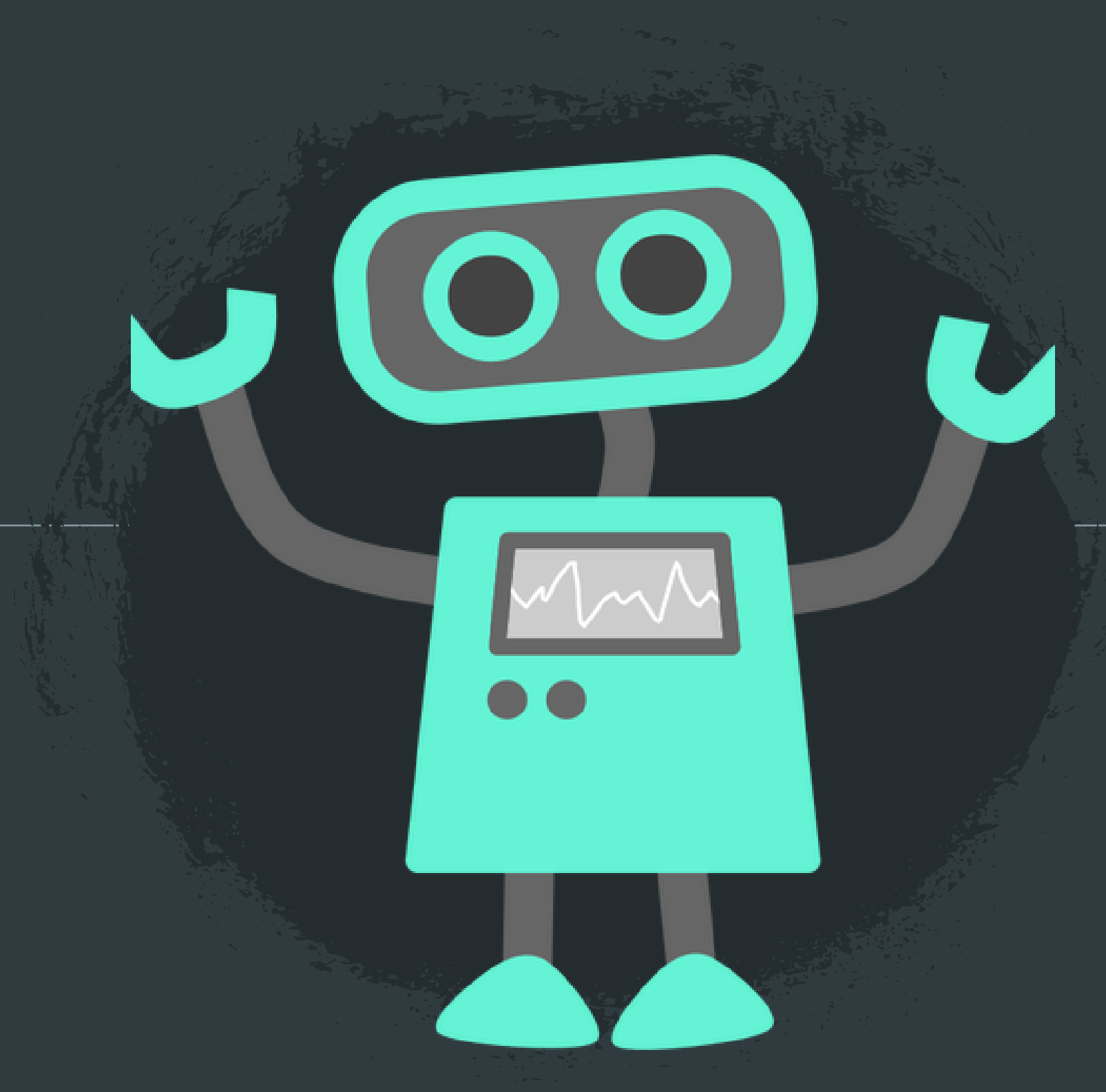
| | MAPE | RMSE |
|---------|---------|------------|
| Linear | 0.0752 | 770644.12 |
| Xgboost | 0.07757 | 814945.451 |

Brand 3

| | MAPE | RMSE |
|---------|---------|------------|
| Linear | 0.1288 | 926250.87 |
| Xgboost | 0.17781 | 1232023.42 |

Final Model

- Brand 1 and 2: **XGboost**
- Brand 3: **Linear**



Allocating A&P

Method

Search for the best A&P that
maximize

Our Net sales for the next year.

Results

| | Advertising Spend (A) | Promotion Spend (P) | Net Sales |
|---------|--------------------------|------------------------|-----------|
| Brand 1 | 452868 | 94418 | 10293600 |
| Brand 2 | 580330 | 26012 | 8569521 |
| Brand 3 | 1499777 | 699993 | 16702441 |

Conclusion

- Lack of Advertising and Promotion for brand 2
- Brand 1 is less sensitive in increase in A&P
- We need further data related to nature of the brand to have more efficient approaches.

THANK YOU!