Forecasting Wingstop

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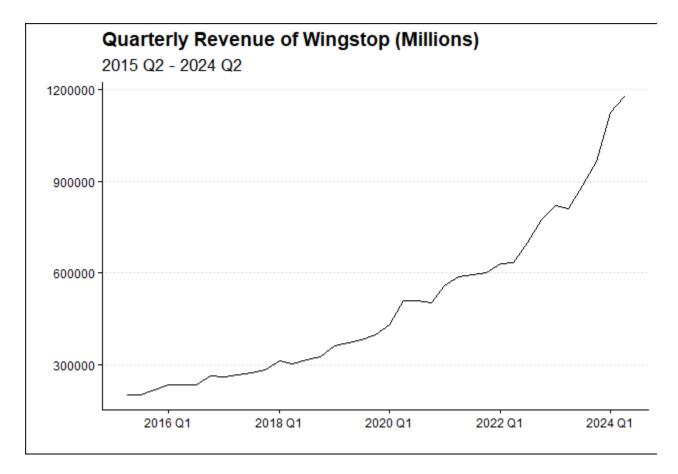
Company Background and Motivation for Variables

Wingstop was founded in 1994 in Garland, Texas by Antonio Swad and Bernadette Fiaschetti. Since opening one shop in '94 they have grown into a chain with more than 2,000 stores in more than 12 countries. Wingstop specializes in quality chicken wings and unique sauces. The company has become one of the fastest-growing restaurant chains in the industry. Originally a small chicken chain, Wingstop has garnered endorsements and investments from sports and entertainment superstars such as Troy Aikman, Tua Tagoviloa, Angel Reese, Richard Sherman, and Rick Ross, who owns 25 stores. Today, the company is a globally recognized brand and one of the most up-and-coming market disruptors within the food service industry.

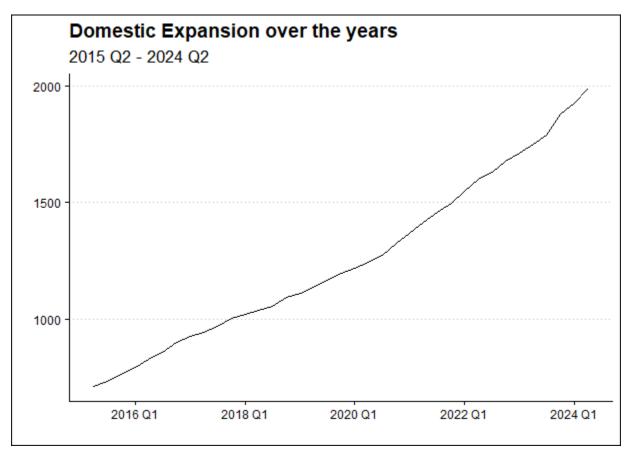
Data and Key Insights

We used data from Wingstop's investor relations portal at Wingstop.com to access their quarterly data from 2015 Q2 to 2024 Q2. First we loaded the necessary packages and read in our data.

1 of 7



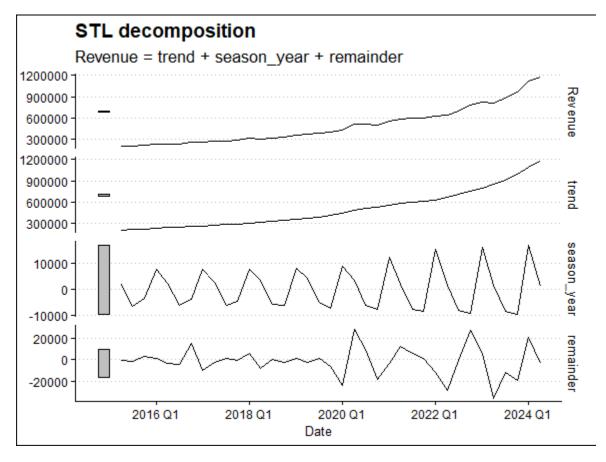
Here you can see the upward trend of revenue by quarter.



Here you can also see the upward trend of our second variable: domestic expansion.

Descriptive Statistics

Here for our seasonality and trend plot for revenue we can see a seasonal component to our data. Specifically spikes at the beginning of each Q1. One hypothesis as to why this could be is the Super Bowl in February. The NBA season kicks off in the winter as well, and ends in April.



Also for domestic expansion, the seasonality follows a similar suit. Domestic expansion rises in Q4, plateaus in Q1, and steeply declines in Q2 and Q3.

Forecasting Methodology

Now what we've done is split our dataset into test and training datasets. Our training dataset is from 2015 Q2 to 2024 Q1. And our test data set is 2024 Q2.

Testing Models and Process Overview

We tested ARIMA, TSLM, TSLM (Quadratic), and ETS on our training dataset for Revenue. We found that ARIMA gave us the least amount of errors, and that is how we justified using ARIMA. We also looked at the Winkler score to justify picking ARIMA.

```
.model .type
                            ME
                                  RMSE
                                            MAE
                                                    MPE MAPE
                                                                 MASE RMSSE
                                                                                  ACF1
  <chr>
          <chr>>
                         <db1>
                                 \langle db 1 \rangle
                                          \langle db 1 \rangle
                                                  <db1> <db1> <db1> <db1>
                                                                                 < db1 >
          Training 4.09e-13 73759. 58998.
                                                  0.851 14.9 0.645 0.659
1 TSLM
                                                                                0.705
2 TSLM2
          Training 0
                                <u>30</u>666. <u>20</u>930. -0.135
                                                          4.52 0.229 0.274
                                                                                0.380
          Training 9.10e+ 3 32916. 21048.
3 ETS
                                                  1.11
                                                          3.87 0.230 0.294
                                                                                0.228
4 ARIMA
          Training 6.29e+ 3 27752. 18462.
                                                  0.914
                                                          3.64 0.202 0.248 -0.016<u>7</u>
>
```

We also checked using our training set, which didn't include 2024 Q2, how close the ARIMA model was to our 2024 Q2 revenue data. And we found that it was very close. For reference, Wingstop's 2024 Q2 revenue was 117600.

```
<chr>>
                       < db 1 >
                                                  <hi170>
             <qtr>
                              [ 698429.4, 1041908]95
                     870169.
          2024 Q2
1 TSLM
2 TSLM2
          2024 Q2 1<u>032</u>526.
                              [ 955235.9, 1109817]95
          2024 Q2 1<u>147</u>066. [1020634.4, 1273498]95
3 ETS
4 ARIMA
          2024 Q2 1<u>154</u>769. [1097061.9, 1212475]95
> View(test)
```

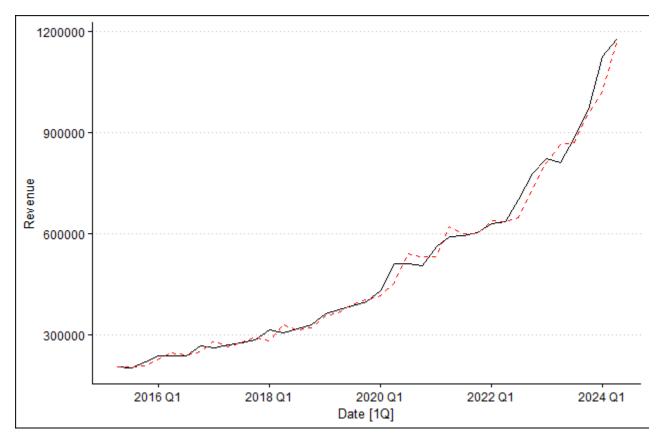
Now that we know ARIMA if the best model that fits our training set, we used cross validation to check which models are best to forecast. We used our actual dataset. (Spoiler Alert) ARIMA is the best model to fit our data.

```
# A tibble: 5 \times 10
  .model .type
                           ME
                                   RMSE
                                               MAE
                                                       MPE
                                                              MAPE
                                                                      MASE RMSSE
                                                                                        ACF1
                       \langle db1 \rangle
                                  <db1>
                                             <db1> <db1> <db1> <db1> <db1>
  <chr>>
            <chr>
1 ARIMA
           Test
                     <u>13</u>289.
                                <u>44</u>573.
                                           <u>36</u>923.
                                                      1.34
                                                              5.23 0.370 0.350 0.043<u>3</u>
2 Combo
           Test
                     <u>16</u>379.
                                <u>46</u>654.
                                           <u>37</u>801.
                                                      1.67
                                                              5.16 0.379 0.367 0.242
3 ETS
            Test
                     <u>19</u>468.
                                <u>51</u>683.
                                           <u>40</u>583.
                                                      2.01
                                                              5.45 0.407 0.406 0.378
4 TSLM
            Test
                    <u>114</u>381. <u>140</u>362. <u>114</u>381. 14.5
                                                             14.5
                                                                     1.15
                                                                             1.10 0.699
                                                              5.92 0.468 0.503 0.618
5 TSLM2
           Test
                     29120.
                                64003.
                                           46748.
                                                      3.07
```

After this, we created a new variable called "fit2" that contained the best models which were, ARIMA, COMBO(the combination of ETS and ARIMA), and TSLM2.

Data Visualization

Here we can see our ARIMA trend line layered in over our Wingstop revenue data:



Our trend line for domestic expansion follows a very similar trend. (Don't want to overdo it with the graphs).

Forecasts

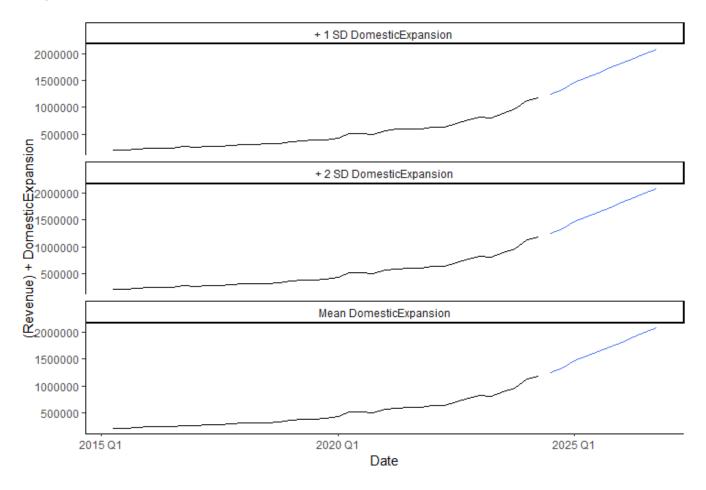
Using our fit2 variable we were able to forecast one guarter into the future for revenue:

```
.model
                                               `95%`
            Date
                     .mean
<chr>>
                     \langle db1 \rangle
                                             <hi170>
           <qtr>
        2024 Q3 1110294. [1019097, 1201491]95
TSLM2
        2024 Q3 1<u>253</u>317. [1195718, 1310915]95
ARIMA
        2024 Q3 1<u>247</u>609. [1111980, 1383238]95
ETS
        2024 Q3 1250463. [1155981, 1344945]95
Combo
```

And domestic expansion:

Forecasting Revenue with Domestic Expansion

Using ARIMA, we forecasted 10 quarters in the future for revenue with domestic expansion.



And received an ACF1 score of -0.00459.

Implications for the Company

After looking at the forecasts, Wingstop has met expectations for revenue growth and follows the projected revenue model almost perfectly every quarter. Every Q1 since 2016 revenue has grown, this corresponds to the trend that revenue has continued to grow quite significantly, especially over the last 5 years, including generating over \$460.06 million in 2023. Proving that Wingstop's franchising business model continues to excel, which is a significant reason why the company is shaking up the food service industry. On the other hand, based on our predictions we can say that Wingstop is growing domestically and globally at a very similar slow rate, however, these store increases aren't necessarily linked to greater revenue or profit. This is likely due to the selective franchise business model that Wingstop uses that emphasizes efficiency and fit rather than rapid expansion. Despite the challenges of expanding internationally, such as translating core ideas and products, Wingstop is steadily making headway into more diverse spaces while maintaining its key differentiators.

Based on our predictions, the outlook for Wingstop is very positive. The trends in the graphs show that the company is in a strong position to continue growing within the food service industry. Wingstop's greatest strengths include its business model, efficiency, quality, and flavors. These things should not change and will continue to help the business grow especially domestically. Yet, despite the overly positive outlook, there are still some significant factors that can derail Wingstop's upward trajectory. Rapidly shifting consumer value expectations and over-eagerness to expand or change of the company's business plan/model can severely impact how the company performs, as these metrics are the biggest underlying reasons Wingstop has had such a meteoric rise. If the company maintains its strong growth pace and continues to rise to the challenge of meeting customer expectations both domestically and internationally, then it will continue to challenge the market leaders and gain market share in an extremely competitive industry.

7 of 7