

Project_40000797

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0.1 Project for COMP 499 - Data Analytics

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Introduction: My Data Analytics project will be focused around the sport of Formula 1. At the beginning of every F1 season, the F1 league decides on specific set of rules that would likely influence some sort of change to the cars. These new rules may have an effect on the engine or the aerodynamics of the car.

Questions: I will be examining the changes to the car in order to determine if these changes have a direct impact on faster lap times the following year, along with increased number of accidents. I will also be using driver performance data to try and predict a drivers final position based on their position in qualifying.

0.3 Data Retrieval and Standard Descriptive Analysis

My Dataset that I found consists of 10 CSV files containing racing data from 1950 to 2017. This data includes:

1. Circuits: **Description about the location of each track that has been included in the Formula 1 circuit since 1950.**
2. Constructor Results: **Results based on Constructor (Team)**
3. Drivers: **Description about every driver that has every raced in the Formula 1 circuit since 1950**
4. Driver Standings **Driver Standings in each year since 1950**
5. Lap Times **Lap times of every driver, from every race**
6. Pit Stops **Amount of pitstop and the time the pitstop took**
7. Qualifying **Qualifying position of each racer, from every race**
8. Races **Each race, at every location, winner, fastest lap, winning team**
9. Results **Results from each race**
10. Seasons **Results at the end of each season**

This Dataset was found at: <https://www.kaggle.com/cjgdev/formula-1-race-data-19502017>

As I mentioned previously, I want to see if there is a correlation between fastest lap times and changes made to the car. A historical list of all changes made to Formula 1 cars can be found here: https://en.wikipedia.org/wiki/History_of_Formula_One_regulations

0.4 Data Wrangling - Cleaning the data

The main dataset that I will be using is the Results.CSV, however currently it contains an abundance of NaN values so we need to clean it up to make it actually usable.

```
[15]: import pandas as pd
      results = pd.read_csv("./data/results.csv")
      results.head()
```

```
[15]:  resultId  raceId  driverId  constructorId  number  grid  position  \
0         1      18         1             1      22.0    1         1.0
1         2      18         2             2       3.0    5         2.0
2         3      18         3             3       7.0    7         3.0
3         4      18         4             4       5.0   11         4.0
4         5      18         5             1      23.0    3         5.0

      positionText  positionOrder  points  laps    time  milliseconds  \
0              1              1    10.0   58  34:50.6      5690616.0
1              2              2     8.0   58   5.478      5696094.0
2              3              3     6.0   58   8.163      5698779.0
3              4              4     5.0   58  17.181      5707797.0
4              5              5     4.0   58  18.014      5708630.0

      fastestLap  rank  fastestLapTime  fastestLapSpeed  statusId
0         39.0   2.0         01:27.5           218.3         1
1         41.0   3.0         01:27.7           217.586         1
2         41.0   5.0         01:28.1           216.719         1
3         58.0   7.0         01:28.6           215.464         1
4         43.0   1.0         01:27.4           218.385         1
```

```
[16]: results['fastestLapTime']
```

```
[16]: 0      01:27.5
1      01:27.7
2      01:28.1
3      01:28.6
4      01:27.4
5      01:29.6
6      01:29.5
7      01:27.9
8      01:28.8
9      01:29.6
10     01:30.9
11     01:31.4
12     01:28.2
13     01:29.5
14     01:29.3
15     01:32.0
16      NaN
17      NaN
```

| | |
|-------|---------|
| 18 | NaN |
| 19 | NaN |
| 20 | NaN |
| 21 | 01:28.7 |
| 22 | 01:35.4 |
| 23 | 01:35.9 |
| 24 | 01:35.9 |
| 25 | 01:36.1 |
| 26 | 01:35.5 |
| 27 | 01:35.4 |
| 28 | 01:36.7 |
| 29 | 01:36.3 |
| | ... |
| 23747 | 01:13.6 |
| 23748 | 01:13.3 |
| 23749 | 01:13.7 |
| 23750 | 01:14.8 |
| 23751 | 01:13.5 |
| 23752 | 01:11.9 |
| 23753 | 01:14.7 |
| 23754 | NaN |
| 23755 | NaN |
| 23756 | NaN |
| 23757 | 01:40.7 |
| 23758 | 01:41.5 |
| 23759 | 01:40.8 |
| 23760 | 01:42.3 |
| 23761 | 01:42.0 |
| 23762 | 01:42.4 |
| 23763 | 01:42.7 |
| 23764 | 01:42.6 |
| 23765 | 01:43.4 |
| 23766 | 01:43.0 |
| 23767 | 01:42.4 |
| 23768 | 01:44.0 |
| 23769 | 01:43.9 |
| 23770 | 01:43.9 |
| 23771 | 01:43.9 |
| 23772 | 01:43.8 |
| 23773 | 01:43.6 |
| 23774 | 01:42.3 |
| 23775 | 01:43.4 |
| 23776 | 01:42.8 |

Name: fastestLapTime, Length: 23777, dtype: object

Notice the NaN values, there are a lot more where that came from because of the lack of recording devices in the 50s and 60s.

```
[17]: results.describe()
```

```
[17]:
```

| | resultId | raceId | driverId | constructorId | number \ |
|-------|--------------|--------------|--------------|---------------|--------------|
| count | 23777.000000 | 23777.000000 | 23777.000000 | 23777.000000 | 23771.000000 |
| mean | 11889.481053 | 487.203937 | 226.515961 | 46.281785 | 16.965462 |
| std | 6864.691322 | 269.904857 | 231.386102 | 56.174091 | 13.644798 |
| min | 1.000000 | 1.000000 | 1.000000 | 1.000000 | 0.000000 |
| 25% | 5945.000000 | 273.000000 | 55.000000 | 6.000000 | 7.000000 |
| 50% | 11889.000000 | 478.000000 | 154.000000 | 25.000000 | 15.000000 |
| 75% | 17833.000000 | 718.000000 | 314.000000 | 57.000000 | 23.000000 |
| max | 23781.000000 | 988.000000 | 843.000000 | 210.000000 | 208.000000 |

| | grid | position | positionOrder | points | laps \ |
|-------|--------------|--------------|---------------|--------------|--------------|
| count | 23777.000000 | 13227.000000 | 23777.000000 | 23777.000000 | 23777.000000 |
| mean | 11.270303 | 7.782264 | 13.081591 | 1.601403 | 45.270598 |
| std | 7.346436 | 4.745105 | 7.824711 | 3.665154 | 30.525404 |
| min | 0.000000 | 1.000000 | 1.000000 | 0.000000 | 0.000000 |
| 25% | 5.000000 | 4.000000 | 7.000000 | 0.000000 | 20.000000 |
| 50% | 11.000000 | 7.000000 | 13.000000 | 0.000000 | 52.000000 |
| 75% | 17.000000 | 11.000000 | 19.000000 | 1.000000 | 66.000000 |
| max | 34.000000 | 33.000000 | 39.000000 | 50.000000 | 200.000000 |

| | milliseconds | fastestLap | rank | statusId |
|-------|--------------|-------------|-------------|--------------|
| count | 6.003000e+03 | 5383.000000 | 5531.000000 | 23777.000000 |
| mean | 6.303313e+06 | 41.061676 | 10.598807 | 18.242293 |
| std | 1.721748e+06 | 17.156435 | 6.272457 | 26.380824 |
| min | 1.474899e+06 | 2.000000 | 0.000000 | 1.000000 |
| 25% | 5.442948e+06 | 29.000000 | 5.000000 | 1.000000 |
| 50% | 5.859428e+06 | 44.000000 | 11.000000 | 11.000000 |
| 75% | 6.495440e+06 | 53.000000 | 16.000000 | 16.000000 |
| max | 1.509054e+07 | 78.000000 | 24.000000 | 136.000000 |

```
[18]: results.count()
```

```
[18]:
```

| | |
|---------------|-------|
| resultId | 23777 |
| raceId | 23777 |
| driverId | 23777 |
| constructorId | 23777 |
| number | 23771 |
| grid | 23777 |
| position | 13227 |
| positionText | 23777 |
| positionOrder | 23777 |
| points | 23777 |
| laps | 23777 |
| time | 6004 |
| milliseconds | 6003 |
| fastestLap | 5383 |

```

rank            5531
fastestLapTime  5383
fastestLapSpeed 5383
statusId        23777
dtype: int64

```

```

[19]: # We can check how many null values we have by using the following:
results.isnull().sum()

```

```

[19]: resultId        0
      raceId          0
      driverId        0
      constructorId   0
      number          6
      grid            0
      position        10550
      positionText     0
      positionOrder    0
      points           0
      laps             0
      time             17773
      milliseconds    17774
      fastestLap       18394
      rank             18246
      fastestLapTime   18394
      fastestLapSpeed  18394
      statusId         0
      dtype: int64

```

```

[20]: results.dropna(inplace=True) # Drop all data where there exists a NaN in the
      ↪ row.
      results.isnull().sum()

```

```

[20]: resultId        0
      raceId          0
      driverId        0
      constructorId   0
      number          0
      grid            0
      position        0
      positionText     0
      positionOrder    0
      points           0
      laps             0
      time             0
      milliseconds    0
      fastestLap       0
      rank             0
      fastestLapTime   0

```

```
fastestLapSpeed    0
statusId          0
dtype: int64
```

```
[21]: results['fastestLapTime']
```

```
[21]: 0      01:27.5
      1      01:27.7
      2      01:28.1
      3      01:28.6
      4      01:27.4
      22     01:35.4
      23     01:35.9
      24     01:35.9
      25     01:36.1
      26     01:35.5
      27     01:35.4
      28     01:36.7
      29     01:36.3
      30     01:36.2
      31     01:35.7
      32     01:37.0
      44     01:33.6
      45     01:33.7
      46     01:33.8
      47     01:33.6
      48     01:33.2
      49     01:34.2
      50     01:34.3
      51     01:34.1
      52     01:34.8
      53     01:35.2
      54     01:34.9
      66     01:21.7
      67     01:21.8
      68     01:22.0
      ...
      23684   01:35.3
      23685   01:35.3
      23697   01:38.8
      23698   01:38.8
      23699   01:37.8
      23700   01:38.1
      23701   01:37.8
      23702   01:40.5
      23703   01:40.5
      23717   01:18.9
      23718   01:19.4
```

```

23719    01:20.1
23720    01:18.8
23737    01:12.5
23738    01:12.5
23739    01:12.5
23740    01:11.8
23741    01:11.0
23742    01:12.0
23743    01:13.5
23744    01:13.5
23745    01:13.1
23757    01:40.7
23758    01:41.5
23759    01:40.8
23760    01:42.3
23761    01:42.0
23762    01:42.4
23763    01:42.7
23764    01:42.6

```

Name: fastestLapTime, Length: 2604, dtype: object

```
[22]: results.count()
```

```

[22]: resultId      2604
      raceId        2604
      driverId      2604
      constructorId 2604
      number        2604
      grid          2604
      position      2604
      positionText   2604
      positionOrder  2604
      points        2604
      laps          2604
      time          2604
      milliseconds   2604
      fastestLap     2604
      rank          2604
      fastestLapTime 2604
      fastestLapSpeed 2604
      statusId      2604
      dtype: int64

```

Our Results are all cleaned and ready to be used!

```

[24]: # Our Data Types
      results.dtypes

```

```

[24]: resultId      int64
      raceId        int64

```

```

driverId          int64
constructorId     int64
number           float64
grid             int64
position         float64
positionText      object
positionOrder     int64
points           float64
laps            int64
time             object
milliseconds      float64
fastestLap       float64
rank            float64
fastestLapTime   object
fastestLapSpeed  object
statusId         int64
dtype: object

```

0.5 Data Integration & Data Enrichment

Combining the Ids from each CSV file

So if you look below, you can see we have a bunch of labels such as: 'RaceId' and 'ConstructorId' ..etc. These IDs correspond to data linked on the other CSV files, so in order to prepare my data for machine learning, I need to merge all these files together and then delete the columns of the data I don't need!

My approach to integrating data

Now my screen is only 13 inches so it will be a bit difficult to manage my data in a table with more than 30 columns. So my approach will be to merge each table individually, then delete the redundant columns, and repeat until all files are merged together and we have all the data we need. Now in order to save myself from making mistakes, I saved every merge to a new variable, I will use each variable as a checkpoint so that if I screw up, I don't have to restart from the beginning. The Final Variable will be called **FinalData**.

```
[25]: results.head()
```

```

[25]:   resultId  raceId  driverId  constructorId  number  grid  position  \
0         1      18         1             1     22.0    1         1.0
1         2      18         2             2      3.0    5         2.0
2         3      18         3             3      7.0    7         3.0
3         4      18         4             4      5.0   11         4.0
4         5      18         5             1     23.0    3         5.0

   positionText  positionOrder  points  laps   time  milliseconds  \
0             1              1    10.0   58  34:50.6     5690616.0
1             2              2     8.0   58   5.478     5696094.0
2             3              3     6.0   58   8.163     5698779.0
3             4              4     5.0   58  17.181     5707797.0
4             5              5     4.0   58  18.014     5708630.0

```


| | fastestLap | rank | fastestLapTime | fastestLapSpeed | statusId |
|---|------------|------|----------------|-----------------|----------|
| 0 | 39.0 | 2.0 | 01:27.5 | 218.3 | 1 |
| 1 | 41.0 | 3.0 | 01:27.7 | 217.586 | 1 |
| 2 | 41.0 | 5.0 | 01:28.1 | 216.719 | 1 |
| 3 | 58.0 | 7.0 | 01:28.6 | 215.464 | 1 |
| 4 | 43.0 | 1.0 | 01:27.4 | 218.385 | 1 |

```
[27]: # Reading the Drivers csv File
drivers = pd.read_csv("../data/drivers.csv", encoding = "ISO-8859-1")
drivers.head()
```

```
[27]:
```

| | driverId | driverRef | number | code | forename | surname | dob | \ |
|---|----------|------------|--------|------|----------|------------|------------|---|
| 0 | 1 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 1 | 2 | heidfeld | NaN | HEI | Nick | Heidfeld | 10/05/1977 | |
| 2 | 3 | rosberg | 6.0 | ROS | Nico | Rosberg | 27/06/1985 | |
| 3 | 4 | alonso | 14.0 | ALO | Fernando | Alonso | 29/07/1981 | |
| 4 | 5 | kovalainen | NaN | KOV | Heikki | Kovalainen | 19/10/1981 | |

| | nationality | url |
|---|-------------|---|
| 0 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 1 | German | http://en.wikipedia.org/wiki/Nick_Heidfeld |
| 2 | German | http://en.wikipedia.org/wiki/Nico_Rosberg |
| 3 | Spanish | http://en.wikipedia.org/wiki/Fernando_Alonso |
| 4 | Finnish | http://en.wikipedia.org/wiki/Heikki_Kovalainen |

```
[29]: #Merging the Drivers CSV file and saving it to merge
merge = pd.merge(results, drivers, how="inner", on="driverId")
merge
```

```
[29]:
```

| | resultId | raceId | driverId | constructorId | number_x | grid | position | \ |
|----|----------|--------|----------|---------------|----------|------|----------|---|
| 0 | 1 | 18 | 1 | 1 | 22.0 | 1 | 1.0 | |
| 1 | 27 | 19 | 1 | 1 | 22.0 | 9 | 5.0 | |
| 2 | 69 | 21 | 1 | 1 | 22.0 | 5 | 3.0 | |
| 3 | 90 | 22 | 1 | 1 | 22.0 | 3 | 2.0 | |
| 4 | 109 | 23 | 1 | 1 | 22.0 | 3 | 1.0 | |
| 5 | 158 | 25 | 1 | 1 | 22.0 | 13 | 10.0 | |
| 6 | 169 | 26 | 1 | 1 | 22.0 | 4 | 1.0 | |
| 7 | 189 | 27 | 1 | 1 | 22.0 | 1 | 1.0 | |
| 8 | 213 | 28 | 1 | 1 | 22.0 | 1 | 5.0 | |
| 9 | 230 | 29 | 1 | 1 | 22.0 | 2 | 2.0 | |
| 10 | 251 | 30 | 1 | 1 | 22.0 | 1 | 3.0 | |
| 11 | 275 | 31 | 1 | 1 | 22.0 | 15 | 7.0 | |
| 12 | 291 | 32 | 1 | 1 | 22.0 | 2 | 3.0 | |
| 13 | 320 | 33 | 1 | 1 | 22.0 | 1 | 12.0 | |
| 14 | 329 | 34 | 1 | 1 | 22.0 | 1 | 1.0 | |
| 15 | 353 | 35 | 1 | 1 | 22.0 | 4 | 5.0 | |
| 16 | 371 | 36 | 1 | 1 | 2.0 | 4 | 3.0 | |
| 17 | 392 | 37 | 1 | 1 | 2.0 | 4 | 2.0 | |

| | | | | | | | |
|------|-------|-----|-----|-----|------|-----|------|
| 18 | 414 | 38 | 1 | 1 | 2.0 | 2 | 2.0 |
| 19 | 436 | 39 | 1 | 1 | 2.0 | 4 | 2.0 |
| 20 | 458 | 40 | 1 | 1 | 2.0 | 2 | 2.0 |
| 21 | 479 | 41 | 1 | 1 | 2.0 | 1 | 1.0 |
| 22 | 501 | 42 | 1 | 1 | 2.0 | 1 | 1.0 |
| 23 | 525 | 43 | 1 | 1 | 2.0 | 2 | 3.0 |
| 24 | 547 | 44 | 1 | 1 | 2.0 | 1 | 3.0 |
| 25 | 589 | 46 | 1 | 1 | 2.0 | 1 | 1.0 |
| 26 | 615 | 47 | 1 | 1 | 2.0 | 2 | 5.0 |
| 27 | 634 | 48 | 1 | 1 | 2.0 | 2 | 2.0 |
| 28 | 658 | 49 | 1 | 1 | 2.0 | 4 | 4.0 |
| 29 | 677 | 50 | 1 | 1 | 2.0 | 1 | 1.0 |
| ... | ... | ... | ... | ... | ... | ... | ... |
| 2574 | 23645 | 982 | 832 | 5 | 55.0 | 10 | 4.0 |
| 2575 | 23708 | 985 | 832 | 4 | 55.0 | 7 | 7.0 |
| 2576 | 22848 | 942 | 834 | 209 | 53.0 | 17 | 12.0 |
| 2577 | 22927 | 948 | 835 | 4 | 30.0 | 13 | 11.0 |
| 2578 | 23195 | 960 | 835 | 4 | 30.0 | 13 | 15.0 |
| 2579 | 23256 | 963 | 835 | 4 | 30.0 | 19 | 10.0 |
| 2580 | 23489 | 974 | 835 | 4 | 30.0 | 16 | 11.0 |
| 2581 | 23614 | 980 | 835 | 4 | 30.0 | 14 | 13.0 |
| 2582 | 23647 | 982 | 835 | 4 | 30.0 | 11 | 6.0 |
| 2583 | 23346 | 967 | 839 | 209 | 31.0 | 22 | 12.0 |
| 2584 | 23428 | 971 | 839 | 10 | 31.0 | 14 | 10.0 |
| 2585 | 23445 | 972 | 839 | 10 | 31.0 | 10 | 7.0 |
| 2586 | 23490 | 974 | 839 | 10 | 31.0 | 15 | 12.0 |
| 2587 | 23504 | 975 | 839 | 10 | 31.0 | 9 | 6.0 |
| 2588 | 23524 | 976 | 839 | 10 | 31.0 | 7 | 6.0 |
| 2589 | 23610 | 980 | 839 | 10 | 31.0 | 9 | 9.0 |
| 2590 | 23627 | 981 | 839 | 10 | 31.0 | 3 | 6.0 |
| 2591 | 23651 | 982 | 839 | 10 | 31.0 | 14 | 10.0 |
| 2592 | 23687 | 984 | 839 | 10 | 31.0 | 5 | 6.0 |
| 2593 | 23707 | 985 | 839 | 10 | 31.0 | 6 | 6.0 |
| 2594 | 23769 | 988 | 839 | 10 | 31.0 | 9 | 8.0 |
| 2595 | 23349 | 967 | 836 | 209 | 94.0 | 19 | 15.0 |
| 2596 | 23528 | 976 | 836 | 15 | 94.0 | 14 | 10.0 |
| 2597 | 23521 | 976 | 840 | 3 | 18.0 | 8 | 3.0 |
| 2598 | 23612 | 980 | 840 | 3 | 18.0 | 15 | 11.0 |
| 2599 | 23628 | 981 | 840 | 3 | 18.0 | 2 | 7.0 |
| 2600 | 23649 | 982 | 840 | 3 | 18.0 | 18 | 8.0 |
| 2601 | 23530 | 976 | 838 | 1 | 2.0 | 18 | 12.0 |
| 2602 | 23615 | 980 | 838 | 1 | 2.0 | 20 | 14.0 |
| 2603 | 23648 | 982 | 838 | 1 | 2.0 | 9 | 7.0 |

| | positionText | positionOrder | points | ... | fastestLapSpeed | statusId | \ |
|---|--------------|---------------|--------|-----|-----------------|----------|---|
| 0 | 1 | 1 | 10.0 | ... | 218.3 | 1 | |
| 1 | 5 | 5 | 4.0 | ... | 209.033 | 1 | |

| | | | | | | |
|------|-----|-----|------|-----|---------|-----|
| 2 | 3 | 3 | 6.0 | ... | 204.323 | 1 |
| 3 | 2 | 2 | 8.0 | ... | 222.085 | 1 |
| 4 | 1 | 1 | 10.0 | ... | 153.152 | 1 |
| 5 | 10 | 10 | 0.0 | ... | 205.022 | 1 |
| 6 | 1 | 1 | 10.0 | ... | 199.398 | 1 |
| 7 | 1 | 1 | 10.0 | ... | 216.552 | 1 |
| 8 | 5 | 5 | 4.0 | ... | 193.533 | 1 |
| 9 | 2 | 2 | 8.0 | ... | 197.285 | 1 |
| 10 | 3 | 3 | 6.0 | ... | 233.175 | 1 |
| 11 | 7 | 7 | 2.0 | ... | 232.44 | 1 |
| 12 | 3 | 3 | 6.0 | ... | 171.969 | 1 |
| 13 | 12 | 12 | 0.0 | ... | 206.47 | 1 |
| 14 | 1 | 1 | 10.0 | ... | 203.722 | 1 |
| 15 | 5 | 5 | 4.0 | ... | 209.177 | 1 |
| 16 | 3 | 3 | 6.0 | ... | 221.083 | 1 |
| 17 | 2 | 2 | 8.0 | ... | 206.355 | 1 |
| 18 | 2 | 2 | 8.0 | ... | 206.674 | 1 |
| 19 | 2 | 2 | 8.0 | ... | 202.205 | 1 |
| 20 | 2 | 2 | 8.0 | ... | 159.528 | 1 |
| 21 | 1 | 1 | 10.0 | ... | 205.239 | 1 |
| 22 | 1 | 1 | 10.0 | ... | 206.101 | 1 |
| 23 | 3 | 3 | 6.0 | ... | 207.34 | 1 |
| 24 | 3 | 3 | 6.0 | ... | 226.6 | 1 |
| 25 | 1 | 1 | 10.0 | ... | 196.724 | 1 |
| 26 | 5 | 5 | 4.0 | ... | 218.464 | 1 |
| 27 | 2 | 2 | 8.0 | ... | 251.456 | 1 |
| 28 | 4 | 4 | 5.0 | ... | 233.002 | 1 |
| 29 | 1 | 1 | 10.0 | ... | 186.259 | 1 |
| ... | ... | ... | ... | ... | ... | ... |
| 2574 | 4 | 4 | 12.0 | ... | 171.151 | 1 |
| 2575 | 7 | 7 | 6.0 | ... | 197.555 | 1 |
| 2576 | 12 | 12 | 0.0 | ... | 183.472 | 1 |
| 2577 | 11 | 11 | 0.0 | ... | 205.376 | 1 |
| 2578 | 15 | 15 | 0.0 | ... | 222.641 | 1 |
| 2579 | 10 | 10 | 1.0 | ... | 200.853 | 1 |
| 2580 | 11 | 11 | 0.0 | ... | 156.801 | 1 |
| 2581 | 13 | 13 | 0.0 | ... | 230.725 | 1 |
| 2582 | 6 | 6 | 8.0 | ... | 170.855 | 1 |
| 2583 | 12 | 12 | 0.0 | ... | 176.686 | 1 |
| 2584 | 10 | 10 | 1.0 | ... | 204.7 | 1 |
| 2585 | 7 | 7 | 6.0 | ... | 213.203 | 1 |
| 2586 | 12 | 12 | 0.0 | ... | 157.072 | 1 |
| 2587 | 6 | 6 | 8.0 | ... | 205.904 | 1 |
| 2588 | 6 | 6 | 8.0 | ... | 204.581 | 1 |
| 2589 | 9 | 9 | 2.0 | ... | 229.804 | 1 |
| 2590 | 6 | 6 | 8.0 | ... | 243.482 | 1 |
| 2591 | 10 | 10 | 1.0 | ... | 169.339 | 1 |

| | | | | | | |
|------|----|----|------|-----|---------|---|
| 2592 | 6 | 6 | 8.0 | ... | 220.419 | 1 |
| 2593 | 6 | 6 | 8.0 | ... | 197.482 | 1 |
| 2594 | 8 | 8 | 4.0 | ... | 01:42.6 | 1 |
| 2595 | 15 | 15 | 0.0 | ... | 176.439 | 1 |
| 2596 | 10 | 10 | 1.0 | ... | 201.743 | 1 |
| 2597 | 3 | 3 | 15.0 | ... | 205.605 | 1 |
| 2598 | 11 | 11 | 0.0 | ... | 228.095 | 1 |
| 2599 | 7 | 7 | 6.0 | ... | 243.559 | 1 |
| 2600 | 8 | 8 | 4.0 | ... | 169.599 | 1 |
| 2601 | 12 | 12 | 0.0 | ... | 202.636 | 1 |
| 2602 | 14 | 14 | 0.0 | ... | 229.415 | 1 |
| 2603 | 7 | 7 | 6.0 | ... | 170.855 | 1 |

| | driverRef | number_y | code | forename | surname | dob | \ |
|------|-----------|----------|------|----------|----------|------------|---|
| 0 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 1 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 2 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 3 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 4 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 5 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 6 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 7 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 8 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 9 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 10 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 11 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 12 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 13 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 14 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 15 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 16 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 17 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 18 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 19 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 20 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 21 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 22 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 23 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 24 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 25 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 26 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 27 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 28 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| 29 | hamilton | 44.0 | HAM | Lewis | Hamilton | 07/01/1985 | |
| ... | ... | ... | ... | ... | ... | ... | |
| 2574 | sainz | 55.0 | SAI | Carlos | Sainz | 01/09/1994 | |
| 2575 | sainz | 55.0 | SAI | Carlos | Sainz | 01/09/1994 | |

| | | | | | | |
|------|---------------|------|-----|-----------|-----------|------------|
| 2576 | rossi | 53.0 | RSS | Alexander | Rossi | 25/09/1991 |
| 2577 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
| 2578 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
| 2579 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
| 2580 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
| 2581 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
| 2582 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
| 2583 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2584 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2585 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2586 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2587 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2588 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2589 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2590 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2591 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2592 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2593 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2594 | ocon | 31.0 | OCO | Esteban | Ocon | 17/09/1996 |
| 2595 | wehrlein | 94.0 | WEH | Pascal | Wehrlein | 18/10/1994 |
| 2596 | wehrlein | 94.0 | WEH | Pascal | Wehrlein | 18/10/1994 |
| 2597 | stroll | 18.0 | STR | Lance | Stroll | 29/10/1998 |
| 2598 | stroll | 18.0 | STR | Lance | Stroll | 29/10/1998 |
| 2599 | stroll | 18.0 | STR | Lance | Stroll | 29/10/1998 |
| 2600 | stroll | 18.0 | STR | Lance | Stroll | 29/10/1998 |
| 2601 | vandoorne | 2.0 | VAN | Stoffel | Vandoorne | 26/03/1992 |
| 2602 | vandoorne | 2.0 | VAN | Stoffel | Vandoorne | 26/03/1992 |
| 2603 | vandoorne | 2.0 | VAN | Stoffel | Vandoorne | 26/03/1992 |

| | nationality | url |
|----|-------------|---|
| 0 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 1 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 2 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 3 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 4 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 5 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 6 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 7 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 8 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 9 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 10 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 11 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 12 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 13 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 14 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 15 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 16 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |

| | | |
|------|----------|---|
| 17 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 18 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 19 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 20 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 21 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 22 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 23 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 24 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 25 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 26 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 27 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 28 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| 29 | British | http://en.wikipedia.org/wiki/Lewis_Hamilton |
| ... | ... | ... |
| 2574 | Spanish | http://en.wikipedia.org/wiki/Carlos_Sainz_Jr |
| 2575 | Spanish | http://en.wikipedia.org/wiki/Carlos_Sainz_Jr |
| 2576 | American | http://en.wikipedia.org/wiki/Alexander_Rossi_%26_Luca_Badoer |
| 2577 | British | http://en.wikipedia.org/wiki/Jolyon_Palmer |
| 2578 | British | http://en.wikipedia.org/wiki/Jolyon_Palmer |
| 2579 | British | http://en.wikipedia.org/wiki/Jolyon_Palmer |
| 2580 | British | http://en.wikipedia.org/wiki/Jolyon_Palmer |
| 2581 | British | http://en.wikipedia.org/wiki/Jolyon_Palmer |
| 2582 | British | http://en.wikipedia.org/wiki/Jolyon_Palmer |
| 2583 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2584 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2585 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2586 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2587 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2588 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2589 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2590 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2591 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2592 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2593 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2594 | French | http://en.wikipedia.org/wiki/Esteban_Ocon |
| 2595 | German | http://en.wikipedia.org/wiki/Pascal_Wehrlein |
| 2596 | German | http://en.wikipedia.org/wiki/Pascal_Wehrlein |
| 2597 | Canadian | http://en.wikipedia.org/wiki/Lance_Stroll |
| 2598 | Canadian | http://en.wikipedia.org/wiki/Lance_Stroll |
| 2599 | Canadian | http://en.wikipedia.org/wiki/Lance_Stroll |
| 2600 | Canadian | http://en.wikipedia.org/wiki/Lance_Stroll |
| 2601 | Belgian | http://en.wikipedia.org/wiki/Stoffel_Vandoorne |
| 2602 | Belgian | http://en.wikipedia.org/wiki/Stoffel_Vandoorne |
| 2603 | Belgian | http://en.wikipedia.org/wiki/Stoffel_Vandoorne |

[2604 rows x 26 columns]

```
[31]: # Let's drop columns we don't need to clean it up a little bit. This is me
      ↪testing dropping 'points' so that I dont
      # screw up
      merge = merge.drop('points', axis = 1)
      merge.head()
```

```
[31]:   resultId  raceId  driverId  constructorId  number_x  grid  position  \
0         1      18         1             1      22.0    1         1.0
1        27      19         1             1      22.0    9         5.0
2        69      21         1             1      22.0    5         3.0
3        90      22         1             1      22.0    3         2.0
4       109      23         1             1      22.0    3         1.0

      positionText  positionOrder  laps  ... fastestLapSpeed  statusId  driverRef  \
0              1              1    58  ...          218.3          1    hamilton
1              5              5    56  ...        209.033          1    hamilton
2              3              3    66  ...        204.323          1    hamilton
3              2              2    58  ...        222.085          1    hamilton
4              1              1    76  ...        153.152          1    hamilton

      number_y  code  forename  surname  dob  nationality  \
0         44.0  HAM    Lewis  Hamilton  07/01/1985    British
1         44.0  HAM    Lewis  Hamilton  07/01/1985    British
2         44.0  HAM    Lewis  Hamilton  07/01/1985    British
3         44.0  HAM    Lewis  Hamilton  07/01/1985    British
4         44.0  HAM    Lewis  Hamilton  07/01/1985    British

      url
0  http://en.wikipedia.org/wiki/Lewis_Hamilton
1  http://en.wikipedia.org/wiki/Lewis_Hamilton
2  http://en.wikipedia.org/wiki/Lewis_Hamilton
3  http://en.wikipedia.org/wiki/Lewis_Hamilton
4  http://en.wikipedia.org/wiki/Lewis_Hamilton
```

[5 rows x 25 columns]

```
[32]: # Dropping columns: 'position, laps, url, nationality, dob, forename, code,
      ↪number_y'
      merge = merge.drop(['position', 'laps', 'url', 'nationality', 'dob',
      ↪'forename', 'code', 'number_y'], axis = 1)
      merge.head()
```

```
[32]:   resultId  raceId  driverId  constructorId  number_x  grid  positionText  \
0         1      18         1             1      22.0    1              1
1        27      19         1             1      22.0    9              5
2        69      21         1             1      22.0    5              3
3        90      22         1             1      22.0    3              2
4       109      23         1             1      22.0    3              1
```

| | positionOrder | time | milliseconds | fastestLap | rank | fastestLapTime | \ |
|---|---------------|---------|--------------|------------|------|----------------|---|
| 0 | 1 | 34:50.6 | 5690616.0 | 39.0 | 2.0 | 01:27.5 | |
| 1 | 5 | 46.548 | 5525103.0 | 53.0 | 3.0 | 01:35.5 | |
| 2 | 3 | 4.187 | 5903238.0 | 20.0 | 3.0 | 01:22.0 | |
| 3 | 2 | 3.779 | 5213230.0 | 31.0 | 2.0 | 01:26.5 | |
| 4 | 1 | 00:42.7 | 7242742.0 | 71.0 | 6.0 | 01:18.5 | |

| | fastestLapSpeed | statusId | driverRef | surname |
|---|-----------------|----------|-----------|----------|
| 0 | 218.3 | 1 | hamilton | Hamilton |
| 1 | 209.033 | 1 | hamilton | Hamilton |
| 2 | 204.323 | 1 | hamilton | Hamilton |
| 3 | 222.085 | 1 | hamilton | Hamilton |
| 4 | 153.152 | 1 | hamilton | Hamilton |

```
[33]: # reading the status csv file
status = pd.read_csv("../data/status.csv", encoding = "ISO-8859-1")
status.head()
```

```
[33]:
```

| | statusId | status |
|---|----------|--------------|
| 0 | 1 | Finished |
| 1 | 2 | Disqualified |
| 2 | 3 | Accident |
| 3 | 4 | Collision |
| 4 | 5 | Engine |

```
[36]: # merging merge and status, saving it to d1
d1 = pd.merge(merge, status, how="inner", on='statusId')
d1.head()
```

```
[36]:
```

| | resultId | raceId | driverId | constructorId | number_x | grid | positionText | \ |
|---|----------|--------|----------|---------------|----------|------|--------------|---|
| 0 | 1 | 18 | 1 | 1 | 22.0 | 1 | 1 | |
| 1 | 27 | 19 | 1 | 1 | 22.0 | 9 | 5 | |
| 2 | 69 | 21 | 1 | 1 | 22.0 | 5 | 3 | |
| 3 | 90 | 22 | 1 | 1 | 22.0 | 3 | 2 | |
| 4 | 109 | 23 | 1 | 1 | 22.0 | 3 | 1 | |

| | positionOrder | time | milliseconds | fastestLap | rank | fastestLapTime | \ |
|---|---------------|---------|--------------|------------|------|----------------|---|
| 0 | 1 | 34:50.6 | 5690616.0 | 39.0 | 2.0 | 01:27.5 | |
| 1 | 5 | 46.548 | 5525103.0 | 53.0 | 3.0 | 01:35.5 | |
| 2 | 3 | 4.187 | 5903238.0 | 20.0 | 3.0 | 01:22.0 | |
| 3 | 2 | 3.779 | 5213230.0 | 31.0 | 2.0 | 01:26.5 | |
| 4 | 1 | 00:42.7 | 7242742.0 | 71.0 | 6.0 | 01:18.5 | |

| | fastestLapSpeed | statusId | driverRef | surname | status |
|---|-----------------|----------|-----------|----------|----------|
| 0 | 218.3 | 1 | hamilton | Hamilton | Finished |
| 1 | 209.033 | 1 | hamilton | Hamilton | Finished |
| 2 | 204.323 | 1 | hamilton | Hamilton | Finished |
| 3 | 222.085 | 1 | hamilton | Hamilton | Finished |


```
4          153.152          1 hamilton Hamilton Finished
```

```
[38]: # dropping columns: 'driverId, statusId, driverRef' and saving it to data.
data = d1.drop(['driverId', 'statusId', 'driverRef'], axis = 1)
data.head()
```

```
[38]:
```

| | resultId | raceId | constructorId | number_x | grid | positionText | \ |
|---|----------|--------|---------------|----------|------|--------------|---|
| 0 | 1 | 18 | 1 | 22.0 | 1 | 1 | |
| 1 | 27 | 19 | 1 | 22.0 | 9 | 5 | |
| 2 | 69 | 21 | 1 | 22.0 | 5 | 3 | |
| 3 | 90 | 22 | 1 | 22.0 | 3 | 2 | |
| 4 | 109 | 23 | 1 | 22.0 | 3 | 1 | |

| | positionOrder | time | milliseconds | fastestLap | rank | fastestLapTime | \ |
|---|---------------|---------|--------------|------------|------|----------------|---|
| 0 | 1 | 34:50.6 | 5690616.0 | 39.0 | 2.0 | 01:27.5 | |
| 1 | 5 | 46.548 | 5525103.0 | 53.0 | 3.0 | 01:35.5 | |
| 2 | 3 | 4.187 | 5903238.0 | 20.0 | 3.0 | 01:22.0 | |
| 3 | 2 | 3.779 | 5213230.0 | 31.0 | 2.0 | 01:26.5 | |
| 4 | 1 | 00:42.7 | 7242742.0 | 71.0 | 6.0 | 01:18.5 | |

| | fastestLapSpeed | surname | status |
|---|-----------------|----------|----------|
| 0 | 218.3 | Hamilton | Finished |
| 1 | 209.033 | Hamilton | Finished |
| 2 | 204.323 | Hamilton | Finished |
| 3 | 222.085 | Hamilton | Finished |
| 4 | 153.152 | Hamilton | Finished |

```
[40]: # reading races csv, dropping columns: 'round, circuitId, date, time, url'
races = pd.read_csv("./data/races.csv", encoding = "ISO-8859-1")
races = races.drop(['round', 'circuitId', 'date', 'time', 'url'], axis = 1)
races.head()
```

```
[40]:
```

| | raceId | year | name |
|---|--------|------|-----------------------|
| 0 | 1 | 2009 | Australian Grand Prix |
| 1 | 2 | 2009 | Malaysian Grand Prix |
| 2 | 3 | 2009 | Chinese Grand Prix |
| 3 | 4 | 2009 | Bahrain Grand Prix |
| 4 | 5 | 2009 | Spanish Grand Prix |

```
[41]: # merging data and races, saving it to cleanedData
cleanedData = pd.merge(data, races, how='inner', on='raceId')
cleanedData.head()
```

```
[41]:
```

| | resultId | raceId | constructorId | number_x | grid | positionText | \ |
|---|----------|--------|---------------|----------|------|--------------|---|
| 0 | 1 | 18 | 1 | 22.0 | 1 | 1 | |
| 1 | 2 | 18 | 2 | 3.0 | 5 | 2 | |
| 2 | 3 | 18 | 3 | 7.0 | 7 | 3 | |
| 3 | 4 | 18 | 4 | 5.0 | 11 | 4 | |
| 4 | 5 | 18 | 1 | 23.0 | 3 | 5 | |

| | positionOrder | time | milliseconds | fastestLap | rank | fastestLapTime | \ |
|---|---------------|---------|--------------|------------|------|----------------|---|
| 0 | 1 | 34:50.6 | 5690616.0 | 39.0 | 2.0 | 01:27.5 | |
| 1 | 2 | 5.478 | 5696094.0 | 41.0 | 3.0 | 01:27.7 | |
| 2 | 3 | 8.163 | 5698779.0 | 41.0 | 5.0 | 01:28.1 | |
| 3 | 4 | 17.181 | 5707797.0 | 58.0 | 7.0 | 01:28.6 | |
| 4 | 5 | 18.014 | 5708630.0 | 43.0 | 1.0 | 01:27.4 | |

| | fastestLapSpeed | surname | status | year | name | | |
|---|-----------------|------------|----------|------|------------|------------|--|
| 0 | 218.3 | Hamilton | Finished | 2008 | Australian | Grand Prix | |
| 1 | 217.586 | Heidfeld | Finished | 2008 | Australian | Grand Prix | |
| 2 | 216.719 | Rosberg | Finished | 2008 | Australian | Grand Prix | |
| 3 | 215.464 | Alonso | Finished | 2008 | Australian | Grand Prix | |
| 4 | 218.385 | Kovalainen | Finished | 2008 | Australian | Grand Prix | |

```
[47]: # reading constructor csv, dropping columns: constructorRef, nationality, url,
      ↪ saving it to d2.
constructors = pd.read_csv("../data/constructors.csv", encoding = "ISO-8859-1")
constructors = constructors.drop(['constructorRef', 'nationality', 'url',
      ↪ 'Unnamed: 5'], axis = 1)
d2 = pd.merge(cleanedData, constructors, how='inner', on = 'constructorId')
d2.head()
```

```
[47]: resultId  raceId  constructorId  number_x  grid positionText  \
0          1       18                1      22.0      1           1
1          5       18                1      23.0      3           5
2         27       19                1      22.0      9           5
3         25       19                1      23.0      8           3
4         69       21                1      22.0      5           3
```

| | positionOrder | time | milliseconds | fastestLap | rank | fastestLapTime | \ |
|---|---------------|---------|--------------|------------|------|----------------|---|
| 0 | 1 | 34:50.6 | 5690616.0 | 39.0 | 2.0 | 01:27.5 | |
| 1 | 5 | 18.014 | 5708630.0 | 43.0 | 1.0 | 01:27.4 | |
| 2 | 5 | 46.548 | 5525103.0 | 53.0 | 3.0 | 01:35.5 | |
| 3 | 3 | 38.45 | 5517005.0 | 19.0 | 7.0 | 01:35.9 | |
| 4 | 3 | 4.187 | 5903238.0 | 20.0 | 3.0 | 01:22.0 | |

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|---|-----------------|------------|----------|------|-----------------------|---------|
| 0 | 218.3 | Hamilton | Finished | 2008 | Australian Grand Prix | McLaren |
| 1 | 218.385 | Kovalainen | Finished | 2008 | Australian Grand Prix | McLaren |
| 2 | 209.033 | Hamilton | Finished | 2008 | Malaysian Grand Prix | McLaren |
| 3 | 208.031 | Kovalainen | Finished | 2008 | Malaysian Grand Prix | McLaren |
| 4 | 204.323 | Hamilton | Finished | 2008 | Spanish Grand Prix | McLaren |

```
[51]: # Dropping some Data and we are done! Saved to FinalData.
FinalData = d2.drop(['constructorId', 'raceId', 'number_x', 'positionText',
      ↪ 'positionText', 'milliseconds', 'time', 'rank'], axis = 1)
FinalData # WE ARE DONE CLEANING, This data is now ready for machine learning.
```

```

[51]:      resultId  grid  positionOrder  fastestLap  fastestLapTime  \
0          1      1          1          39.0          01:27.5
1          5      3          5          43.0          01:27.4
2         27      9          5          53.0          01:35.5
3         25      8          3          19.0          01:35.9
4         69      5          3          20.0          01:22.0
5         90      3          2          31.0          01:26.5
6        109      3          1          71.0          01:18.5
7        116      4          8          74.0          01:17.3
8        158     13         10          40.0          01:17.5
9        152     10          4          46.0          01:17.1
10       169      4          1          16.0          01:32.8
11       189      1          1          17.0          01:16.0
12       193      3          5          63.0          01:16.5
13       213      1          5          15.0          01:21.5
14       209      2          1          19.0          01:21.8
15       230      2          2          16.0          01:38.9
16       232      5          4          19.0          01:39.1
17       251      1          3          20.0          01:48.1
18       275     15          7          52.0          01:29.7
19       270      2          2          53.0          01:30.3
20       291      2          3          14.0          01:46.1
21       298      5         10          14.0          01:47.3
22       320      1         12          65.0          01:19.6
23       329      1          1          13.0          01:36.3
24       353      4          5          31.0          01:14.2
25       355      5          7          36.0          01:14.2
26       371      4          3          20.0          01:26.4
27       370      2          2          20.0          01:26.3
28       392      4          2          22.0          01:36.7
29       391      2          1          42.0          01:36.9
...      ...      ...      ...      ...      ...
2574     1557      6          3          24.0          01:31.0
2575     1559      5          5          55.0          01:31.1
2576     1576      1          2          28.0          01:21.2
2577     1599      3          5          47.0          01:17.7
2578     1637      5          3          13.0          01:30.5
2579     1699      4          5          50.0          01:16.0
2580     1718      3          4          10.0          01:19.5
2581     1725      8         11          12.0          01:20.8
2582     1736     13          2          11.0          01:14.1
2583     1742      8          8          29.0          01:14.6
2584     1759      4          5          47.0          01:20.4
2585     1816      3          2          33.0          01:32.9
2586     1820     18          6          36.0          01:33.5
2587     1837      5          3          33.0          01:33.8
2588     1838      4          4          28.0          01:33.7

```

| | | | | | |
|------|-------|----|----|------|---------|
| 2589 | 1860 | 6 | 6 | 51.0 | 01:11.9 |
| 2590 | 1616 | 2 | 2 | 40.0 | 01:15.2 |
| 2591 | 1677 | 3 | 3 | 47.0 | 01:10.7 |
| 2592 | 1797 | 6 | 3 | 13.0 | 01:22.7 |
| 2593 | 1798 | 5 | 4 | 32.0 | 01:22.7 |
| 2594 | 1657 | 2 | 3 | 68.0 | 01:14.2 |
| 2595 | 1505 | 19 | 11 | 13.0 | 01:36.6 |
| 2596 | 1641 | 14 | 7 | 37.0 | 01:31.9 |
| 2597 | 1703 | 12 | 9 | 53.0 | 01:16.0 |
| 2598 | 1722 | 9 | 8 | 11.0 | 01:20.8 |
| 2599 | 1740 | 11 | 6 | 65.0 | 01:14.9 |
| 2600 | 1744 | 12 | 10 | 33.0 | 01:15.0 |
| 2601 | 1780 | 13 | 6 | 11.0 | 01:47.5 |
| 2602 | 1803 | 12 | 9 | 53.0 | 01:23.1 |
| 2603 | 21656 | 22 | 17 | 47.0 | 01:48.6 |

| | fastestLapSpeed | surname | status | year | name_x \ |
|----|-----------------|------------|----------|------|-----------------------|
| 0 | 218.3 | Hamilton | Finished | 2008 | Australian Grand Prix |
| 1 | 218.385 | Kovalainen | Finished | 2008 | Australian Grand Prix |
| 2 | 209.033 | Hamilton | Finished | 2008 | Malaysian Grand Prix |
| 3 | 208.031 | Kovalainen | Finished | 2008 | Malaysian Grand Prix |
| 4 | 204.323 | Hamilton | Finished | 2008 | Spanish Grand Prix |
| 5 | 222.085 | Hamilton | Finished | 2008 | Turkish Grand Prix |
| 6 | 153.152 | Hamilton | Finished | 2008 | Monaco Grand Prix |
| 7 | 155.586 | Kovalainen | Finished | 2008 | Monaco Grand Prix |
| 8 | 205.022 | Hamilton | Finished | 2008 | French Grand Prix |
| 9 | 205.87 | Kovalainen | Finished | 2008 | French Grand Prix |
| 10 | 199.398 | Hamilton | Finished | 2008 | British Grand Prix |
| 11 | 216.552 | Hamilton | Finished | 2008 | German Grand Prix |
| 12 | 215.261 | Kovalainen | Finished | 2008 | German Grand Prix |
| 13 | 193.533 | Hamilton | Finished | 2008 | Hungarian Grand Prix |
| 14 | 192.917 | Kovalainen | Finished | 2008 | Hungarian Grand Prix |
| 15 | 197.285 | Hamilton | Finished | 2008 | European Grand Prix |
| 16 | 196.831 | Kovalainen | Finished | 2008 | European Grand Prix |
| 17 | 233.175 | Hamilton | Finished | 2008 | Belgian Grand Prix |
| 18 | 232.44 | Hamilton | Finished | 2008 | Italian Grand Prix |
| 19 | 230.95 | Kovalainen | Finished | 2008 | Italian Grand Prix |
| 20 | 171.969 | Hamilton | Finished | 2008 | Singapore Grand Prix |
| 21 | 169.943 | Kovalainen | Finished | 2008 | Singapore Grand Prix |
| 22 | 206.47 | Hamilton | Finished | 2008 | Japanese Grand Prix |
| 23 | 203.722 | Hamilton | Finished | 2008 | Chinese Grand Prix |
| 24 | 209.177 | Hamilton | Finished | 2008 | Brazilian Grand Prix |
| 25 | 209.042 | Kovalainen | Finished | 2008 | Brazilian Grand Prix |
| 26 | 221.083 | Hamilton | Finished | 2007 | Australian Grand Prix |
| 27 | 221.178 | Alonso | Finished | 2007 | Australian Grand Prix |
| 28 | 206.355 | Hamilton | Finished | 2007 | Malaysian Grand Prix |
| 29 | 206.014 | Alonso | Finished | 2007 | Malaysian Grand Prix |

| | | | | | |
|------|---------|------------|----------|------|--------------------------|
| ... | ... | ... | ... | ... | ... |
| 2574 | 214.393 | Button | Finished | 2004 | Bahrain Grand Prix |
| 2575 | 214.061 | Sato | Finished | 2004 | Bahrain Grand Prix |
| 2576 | 218.701 | Button | Finished | 2004 | San Marino Grand Prix |
| 2577 | 214.439 | Sato | Finished | 2004 | Spanish Grand Prix |
| 2578 | 204.879 | Button | Finished | 2004 | European Grand Prix |
| 2579 | 209.021 | Button | Finished | 2004 | French Grand Prix |
| 2580 | 232.835 | Button | Finished | 2004 | British Grand Prix |
| 2581 | 229.082 | Sato | Finished | 2004 | British Grand Prix |
| 2582 | 222.167 | Button | Finished | 2004 | German Grand Prix |
| 2583 | 220.773 | Sato | Finished | 2004 | German Grand Prix |
| 2584 | 196.103 | Button | Finished | 2004 | Hungarian Grand Prix |
| 2585 | 211.154 | Button | Finished | 2004 | Chinese Grand Prix |
| 2586 | 209.804 | Sato | Finished | 2004 | Chinese Grand Prix |
| 2587 | 222.824 | Button | Finished | 2004 | Japanese Grand Prix |
| 2588 | 223.007 | Sato | Finished | 2004 | Japanese Grand Prix |
| 2589 | 215.626 | Sato | Finished | 2004 | Brazilian Grand Prix |
| 2590 | 159.851 | Button | Finished | 2004 | Monaco Grand Prix |
| 2591 | 213.372 | Sato | Finished | 2004 | United States Grand Prix |
| 2592 | 252.262 | Button | Finished | 2004 | Italian Grand Prix |
| 2593 | 252.296 | Sato | Finished | 2004 | Italian Grand Prix |
| 2594 | 211.453 | Button | Finished | 2004 | Canadian Grand Prix |
| 2595 | 203.22 | Monteiro | Finished | 2005 | Chinese Grand Prix |
| 2596 | 201.678 | Webber | Finished | 2004 | European Grand Prix |
| 2597 | 209.063 | Webber | Finished | 2004 | French Grand Prix |
| 2598 | 229.145 | Webber | Finished | 2004 | British Grand Prix |
| 2599 | 219.895 | Webber | Finished | 2004 | German Grand Prix |
| 2600 | 219.42 | Klien | Finished | 2004 | German Grand Prix |
| 2601 | 233.595 | Klien | Finished | 2004 | Belgian Grand Prix |
| 2602 | 250.99 | Webber | Finished | 2004 | Italian Grand Prix |
| 2603 | 184.078 | de la Rosa | Finished | 2012 | Abu Dhabi Grand Prix |

| | |
|----|---------|
| | name_y |
| 0 | McLaren |
| 1 | McLaren |
| 2 | McLaren |
| 3 | McLaren |
| 4 | McLaren |
| 5 | McLaren |
| 6 | McLaren |
| 7 | McLaren |
| 8 | McLaren |
| 9 | McLaren |
| 10 | McLaren |
| 11 | McLaren |
| 12 | McLaren |
| 13 | McLaren |

| | |
|------|---------|
| 14 | McLaren |
| 15 | McLaren |
| 16 | McLaren |
| 17 | McLaren |
| 18 | McLaren |
| 19 | McLaren |
| 20 | McLaren |
| 21 | McLaren |
| 22 | McLaren |
| 23 | McLaren |
| 24 | McLaren |
| 25 | McLaren |
| 26 | McLaren |
| 27 | McLaren |
| 28 | McLaren |
| 29 | McLaren |
| ... | ... |
| 2574 | BAR |
| 2575 | BAR |
| 2576 | BAR |
| 2577 | BAR |
| 2578 | BAR |
| 2579 | BAR |
| 2580 | BAR |
| 2581 | BAR |
| 2582 | BAR |
| 2583 | BAR |
| 2584 | BAR |
| 2585 | BAR |
| 2586 | BAR |
| 2587 | BAR |
| 2588 | BAR |
| 2589 | BAR |
| 2590 | BAR |
| 2591 | BAR |
| 2592 | BAR |
| 2593 | BAR |
| 2594 | BAR |
| 2595 | Jordan |
| 2596 | Jaguar |
| 2597 | Jaguar |
| 2598 | Jaguar |
| 2599 | Jaguar |
| 2600 | Jaguar |
| 2601 | Jaguar |
| 2602 | Jaguar |
| 2603 | HRT |

[2604 rows x 11 columns]

```
[54]: FinalData.to_csv('FinalData.csv', sep=',') # Saving the DF incase something_
      ↳ happens.
```

```
[55]: # No Nulls Found, so all my data is cleaned.
      FinalData.isnull().sum()
```

```
[55]: resultId      0
      grid          0
      positionOrder 0
      fastestLap     0
      fastestLapTime 0
      fastestLapSpeed 0
      surname        0
      status         0
      year           0
      name_x         0
      name_y         0
      dtype: int64
```

```
[3]: import pandas as pd
      FinalData = pd.read_csv('./FinalData.csv')
      FinalData.sample(20)
```

```
[3]: Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
946          946    21256     8                1         53.0         01:41.7
1198         1198     1424     6               10          5.0         01:23.6
1273         1273      354    10                6         32.0         01:14.1
1843         1843    22269     8                8         56.0         01:19.4
2187         2187    22501     2                2         62.0         01:13.6
2104         2104    21068     8                5         46.0         01:27.4
102          102    20854     6                6         47.0         01:31.2
2542         2542    23346    22               12         47.0         01:27.8
1119         1119      722     1                2         71.0         01:12.6
2480         2480    21964    11               11         45.0         01:26.9
2067         2067     7795     6                2         46.0         01:24.9
950          950    21310     9                7         44.0         01:38.2
1754         1754    21296    17               17         40.0         01:41.3
1756         1756    21317    17               14         43.0         01:37.1
720          720    22928    14               12         45.0         01:32.5
1975         1975    23276     9                8         39.0         01:37.4
854          854      315     5                7         55.0         01:18.4
432          432     7737     5                4         65.0         01:22.5
1631         1631    21554     7               11         53.0         01:53.7
1607         1607     7715     4                2         42.0         01:34.1

      fastestLapSpeed  surname  status  year  name_x  \
```

| | | | | | |
|------|---------|------------|----------|------|-----------------------|
| 946 | 196.25 | Alonso | Finished | 2012 | Malaysian Grand Prix |
| 1198 | 249.507 | Schumacher | Finished | 2005 | Italian Grand Prix |
| 1273 | 209.465 | Glock | Finished | 2008 | Brazilian Grand Prix |
| 1843 | 197.73 | Vergne | Finished | 2014 | Canadian Grand Prix |
| 2187 | 210.895 | Hamilton | Finished | 2014 | Brazilian Grand Prix |
| 2104 | 238.607 | Schumacher | Finished | 2011 | Italian Grand Prix |
| 102 | 210.786 | Button | Finished | 2011 | Turkish Grand Prix |
| 2542 | 176.686 | Ocon | Finished | 2016 | Brazilian Grand Prix |
| 1119 | 213.716 | Massa | Finished | 2007 | Brazilian Grand Prix |
| 2480 | 239.853 | Rikkönen | Finished | 2013 | Italian Grand Prix |
| 2067 | 245.538 | Button | Finished | 2009 | Italian Grand Prix |
| 950 | 198.397 | Alonso | Finished | 2012 | Bahrain Grand Prix |
| 1754 | 193.811 | Ricciardo | Finished | 2012 | Chinese Grand Prix |
| 1756 | 200.737 | Vergne | Finished | 2012 | Bahrain Grand Prix |
| 720 | 206.494 | Magnussen | Finished | 2016 | Australian Grand Prix |
| 1975 | 214.74 | Hülkenberg | Finished | 2016 | Japanese Grand Prix |
| 854 | 209.456 | Massa | Finished | 2008 | Japanese Grand Prix |
| 432 | 191.245 | Rosberg | Finished | 2009 | Hungarian Grand Prix |
| 1631 | 160.585 | Webber | Finished | 2012 | Singapore Grand Prix |
| 1607 | 196.97 | Vettel | Finished | 2009 | German Grand Prix |

| | |
|------|----------------|
| | name_y |
| 946 | Ferrari |
| 1198 | Ferrari |
| 1273 | Toyota |
| 1843 | Toro Rosso |
| 2187 | Mercedes |
| 2104 | Mercedes |
| 102 | McLaren |
| 2542 | Manor Marussia |
| 1119 | Ferrari |
| 2480 | Lotus F1 |
| 2067 | Brawn |
| 950 | Ferrari |
| 1754 | Toro Rosso |
| 1756 | Toro Rosso |
| 720 | Renault |
| 1975 | Force India |
| 854 | Ferrari |
| 432 | Williams |
| 1631 | Red Bull |
| 1607 | Red Bull |

0.6 Question 1: What is the likeliness that a driver will finish in a desired position if they finish 1st in qualifying?

Podium positions


```
[61]: # 1 grid, 1 Position = 140 / 230 = 60.86% chance of finishing 1
      (FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 1)]).
      →shape[0]/230) * 100
```

[61]: 60.86956521739131

```
[62]: # 1 grid, 2 Position = 45 / 230 = 19.56% chance of finishing 2
      (FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 2)]).
      →shape[0]/230) * 100
```

[62]: 19.565217391304348

```
[63]: # 1 grid, 3 Position = 23 / 230 = 10% chance of finishing 3
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 3)].
      →shape[0]/230*100
```

[63]: 10.0

Non Podiums - In points

```
[64]: # 1 grid, 4 Position = 8 / 230 = 3.47% chance of finishing 4
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 4)].
      →shape[0]/230*100
```

[64]: 3.4782608695652173

```
[65]: # 1 grid, 5 Position = 4 / 230 = 1.74% chance of finishing 5
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 5)].
      →shape[0]/230*100
```

[65]: 1.7391304347826086

```
[66]: # 1 grid, 6 Position = 3 / 230 = 1.30% chance of finishing 6
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 6)].
      →shape[0]/230*100
```

[66]: 1.3043478260869565

```
[67]: # 1 grid, 7 Position = 1 / 230 = .43% chance of finishing 7
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 7)].
      →shape[0]/230*100
```

[67]: 0.43478260869565216

```
[68]: # 1 grid, 8 Position = 2 / 230 = .86% chance of finishing 8
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 8)].
      →shape[0]/230*100
```

[68]: 0.8695652173913043

```
[69]: # 1 grid, 9 Position = 2 / 230 = .86% chance of finishing 9
      FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 9)].
      →shape[0]/230*100
```

[69]: 0.8695652173913043

Given a first place qualification:

99.08% chance that a driver will finish within points range [1, 10]
< 1% chance that a driver will finish out of points range
90% chance of finishing on the podium

```
[59]: FinalData[(FinalData['grid'] == 1)].shape[0]
```

```
[59]: 230
```

```
[97]: # Simple automation for finding data for my bar chart  
# First Place on Grid:  
for i in range(1,15):  
    print(FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] ==  
→i)].shape[0])
```

```
140  
45  
23  
8  
4  
3  
3  
1  
2  
2  
0  
0  
1  
1  
0
```

```
[96]: # Simple automation for finding data for my bar chart  
# Second Place on Grid:  
for i in range(1,15):  
    print(FinalData[(FinalData['grid'] == 2) & (FinalData['positionOrder'] ==  
→i)].shape[0])
```

```
65  
62  
38  
19  
15  
3  
7  
5  
6  
0  
1  
0  
1  
1
```

```
[95]: # Simple automation for finding data for my bar chart
# Third Place on Grid:
for i in range(1,15):
    print(FinalData[(FinalData['grid'] == 3) & (FinalData['positionOrder'] ==
→i)].shape[0])
```

```
21
49
56
31
25
9
6
7
2
5
1
1
0
1
```

```
[99]: # Simple automation for finding data for my bar chart
# Fourth Place on Grid:
for i in range(1,15):
    print(FinalData[(FinalData['grid'] == 4) & (FinalData['positionOrder'] ==
→i)].shape[0])
```

```
12
39
32
42
26
24
15
10
5
0
1
0
0
0
1
```

```
[120]: # Simple automation for finding data for my bar chart
# Fifth Place on Grid:
for i in range(1,15):
    print(FinalData[(FinalData['grid'] == 5) & (FinalData['positionOrder'] ==
→i)].shape[0])
```

7
21
31
45
30
25
13
6
2
10
4
0
0
1

```
[138]: # Simple automation for finding data for my bar chart
# Sixth Place on Grid:
for i in range(1,11):
    print(FinalData[(FinalData['grid'] == 6) & (FinalData['positionOrder'] ==
→i)].shape[0])
```

6
11
24
31
31
29
17
9
7
3

```
[146]: # Simple automation for finding data for my bar chart
# Seventh Place on Grid:
for i in range(1,15):
    print(FinalData[(FinalData['grid'] == 7) & (FinalData['positionOrder'] ==
→i)].shape[0])
```

3
9
13
10
28
29
19
18
11

7
3
6
5
0

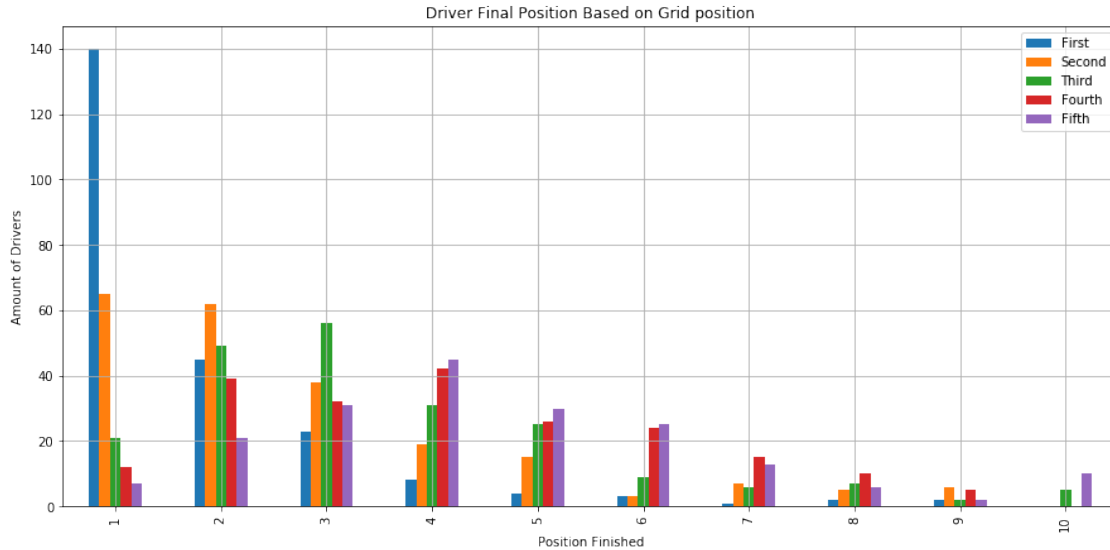
```
[151]: import matplotlib.pyplot as plt
First = [140,45,23,8,4,3,1,2,2,0]
Second =[65,62,38,19,15,3,7,5,6,0]
Third = [21,49,56,31,25,9,6,7,2,5]
Fourth =[12,39,32,42,26,24,15,10,5,0]
Fifth = [7, 21, 31, 45, 30, 25, 13, 6, 2, 10]
Sixth = [6,11,24,31,31,29,17,9,7,3]
Seventh = [3,9,13,10,28,29,19,18,11]

#Not used for bar chat

index = ['1','2','3','4','5','6','7','8','9','10']

barPlot = pd.DataFrame({
    'First': First,
    'Second': Second,
    'Third':Third,
    'Fourth':Fourth,
    'Fifth': Fifth
}, index = index)

barPlot.plot.bar(title='Driver Final Position Based on Grid position',
    ↳figsize=(15,7), grid = True)
plt.xlabel('Position Finished')
plt.ylabel('Amount of Drivers')
plt.show()
```



```
[133]: # Checking if Data is Normal Distribution..
FourthDF = pd.DataFrame({
    'Fourth' : Fourth
})

FourthDF.skew(axis = 0) # Which gives us Symmetric Data! This Distribution is
↳Symmetrix as well...
```

```
[133]: Fourth    0.1751
dtype: float64
```

```
[134]: FifthDF = pd.DataFrame({
    'Fifth' : Fifth
})

FifthDF.skew(axis = 0) # Which gives us Symmetric Data!
```

```
[134]: Fifth    0.592572
dtype: float64
```

```
[135]: ThirdDF = pd.DataFrame({
    'Third' : Third
})

ThirdDF.skew(axis = 0) # Which gives us Moderately Skewed!
```

```
[135]: Third    0.909016
dtype: float64
```

```
[142]: SixthDF = pd.DataFrame({
    'Sixth' : Sixth
})
```

```
SixthDF.skew(axis = 0) # Which gives us Symmetric!
```

```
[142]: Sixth      0.247902  
dtype: float64
```

```
[152]: SeventhDF = pd.DataFrame({  
      'Seventh' : Seventh  
})
```

```
SeventhDF.skew(axis = 0) # Which gives us Symmetric!
```

```
[152]: Seventh      0.448699  
dtype: float64
```

0.7 Question 2: If you qualify 1, 2 or 3: what is the chance you will finish on the podium?

```
[76]: FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 1)].  
      →shape[0]/230*100
```

```
[76]: 60.86956521739131
```

```
[78]: FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 2)].  
      →shape[0]/230*100
```

```
[78]: 19.565217391304348
```

```
[77]: FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 3)].  
      →shape[0]/230*100
```

```
[77]: 10.0
```

```
[86]: FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] > 3)].shape[0]/  
      →230*100
```

```
[86]: 9.565217391304348
```

**Given a first place qualification:
drivers have a 90.45% chance of finishing on the podium and a 9.55% chance of missing podium**

```
[70]: FinalData[(FinalData['grid'] == 2) & (FinalData['positionOrder'] == 1)].  
      →shape[0]/230*100
```

```
[70]: 28.26086956521739
```

```
[71]: FinalData[(FinalData['grid'] == 2) & (FinalData['positionOrder'] == 2)].  
      →shape[0]/230*100
```

```
[71]: 26.956521739130434
```

```
[72]: FinalData[(FinalData['grid'] == 2) & (FinalData['positionOrder'] == 3)].  
      →shape[0]/230*100
```

[72]: 16.52173913043478

```
[85]: FinalData[(FinalData['grid'] == 2) & (FinalData['positionOrder'] > 3)].shape[0]/  
      ↪230*100
```

[85]: 25.217391304347824

Given a second place qualification:
drivers have a 71.73% chance of finishing on the podium and a 25.21% chance of missing podium

```
[73]: FinalData[(FinalData['grid'] == 3) & (FinalData['positionOrder'] == 1)].  
      ↪shape[0]/230*100
```

[73]: 9.130434782608695

```
[74]: FinalData[(FinalData['grid'] == 3) & (FinalData['positionOrder'] == 2)].  
      ↪shape[0]/230*100
```

[74]: 21.304347826086957

```
[75]: FinalData[(FinalData['grid'] == 3) & (FinalData['positionOrder'] == 3)].  
      ↪shape[0]/230*100
```

[75]: 24.347826086956523

```
[84]: FinalData[(FinalData['grid'] == 3) & (FinalData['positionOrder'] > 3)].shape[0]/  
      ↪230*100
```

[84]: 38.26086956521739

Given a third place qualification:
drivers have a 54.77% chance of finishing on the podium and a 38.23% chance of missing podium

0.8 Next Section: Between 2013 and 2014, a decision was made to manipulate the formula of the cars. Starting in 2014, there would be a new V6 engine with 1600cc / 8 gearbox.

CC is the displacement volume of the engine, so it means that that the engine has more cylinders and a higher swept volume which directly translates into horse power and torque of the vehicle.

<https://bleacherreport.com/articles/2003467-are-2014-formula-1-cars-slower-analysing-lap-times-at-australian-grand-prix>

Between 2013 and 14 there was a 1.77 second drop in fastest average laptime between racers that stayed on the same team.

Sebastian Vettel: Difference in Race times between 2013 and 2014 average in each race: -2.29 seconds

Fernando Alonso: Difference in Race times between 2013 and 2014 average in each race: -2.07 seconds

Nico Rosberg: Difference in Race times between 2013 and 2014 average in each race: -1.78 seconds

Felipe Massa: Difference in Race times between 2013 and 2014 average in each race: -0.92 seconds


```
[39]: # Checking the Driver's average lap time Below
```

```
[41]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
→((FinalData['surname'] == 'Vettel'))].sort_values(by=['surname', 'name_x']).
→head(6)
```

```
[41]:      Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
1487          1487    22064     2                1         51.0          01:43.9
1518          1518    22525    19                8         51.0          01:45.6
1464          1464    21714     1                3         42.0          01:30.4
1469          1469    21778     2                1         55.0          01:37.0
1493          1493    22179    10                6         18.0          01:39.3
1480          1480    21932     2                1         40.0          01:50.8
```

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|------|-----------------|---------|----------|------|-----------------------|----------|
| 1487 | 192.451 | Vettel | Finished | 2013 | Abu Dhabi Grand Prix | Red Bull |
| 1518 | 189.427 | Vettel | Finished | 2014 | Abu Dhabi Grand Prix | Red Bull |
| 1464 | 211.16 | Vettel | Finished | 2013 | Australian Grand Prix | Red Bull |
| 1469 | 200.938 | Vettel | Finished | 2013 | Bahrain Grand Prix | Red Bull |
| 1493 | 196.181 | Vettel | Finished | 2014 | Bahrain Grand Prix | Red Bull |
| 1480 | 227.657 | Vettel | Finished | 2013 | Belgian Grand Prix | Red Bull |

```
[43]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
→((FinalData['surname'] == 'Alonso'))].sort_values(by=['surname', 'name_x']).
→head(6)
```

```
[43]:      Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
994          994    22068    10                5         55.0          01:43.4
1021         1021    22526     8                9         45.0          01:47.4
970          970    21713     5                2         53.0          01:29.6
1167         1167    22133     5                4         57.0          01:33.2
1007         1007    22288     4                5         58.0          01:12.6
975          975    21785     3                8         41.0          01:37.2
```

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|------|-----------------|---------|----------|------|-----------------------|---------|
| 994 | 193.305 | Alonso | Finished | 2013 | Abu Dhabi Grand Prix | Ferrari |
| 1021 | 186.126 | Alonso | Finished | 2014 | Abu Dhabi Grand Prix | Ferrari |
| 970 | 213.162 | Alonso | Finished | 2013 | Australian Grand Prix | Ferrari |
| 1167 | 204.867 | Alonso | Finished | 2014 | Australian Grand Prix | Ferrari |
| 1007 | 214.527 | Alonso | Finished | 2014 | Austrian Grand Prix | Ferrari |
| 975 | 200.436 | Alonso | Finished | 2013 | Bahrain Grand Prix | Ferrari |

```
[38]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
→((FinalData['surname'] == 'Rosberg'))].sort_values(by=['surname', 'name_x']).
→head(6)
```

```
[38]:      Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
2156         2156    22066     3                3         51.0          01:44.5
2313         2313    22130     3                1         19.0          01:32.5
2172         2172    22284     3                1         50.0          01:12.6
```

| | | | | | | |
|------|------|-------|---|---|------|---------|
| 2135 | 2135 | 21786 | 1 | 9 | 48.0 | 01:37.6 |
| 2164 | 2164 | 22175 | 1 | 2 | 49.0 | 01:37.0 |
| 2146 | 2146 | 21935 | 4 | 4 | 39.0 | 01:51.6 |

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|------|-----------------|---------|----------|------|-----------------------|----------|
| 2156 | 191.41 | Rosberg | Finished | 2013 | Abu Dhabi Grand Prix | Mercedes |
| 2313 | 206.436 | Rosberg | Finished | 2014 | Australian Grand Prix | Mercedes |
| 2172 | 214.518 | Rosberg | Finished | 2014 | Austrian Grand Prix | Mercedes |
| 2135 | 199.647 | Rosberg | Finished | 2013 | Bahrain Grand Prix | Mercedes |
| 2164 | 200.816 | Rosberg | Finished | 2014 | Bahrain Grand Prix | Mercedes |
| 2146 | 225.971 | Rosberg | Finished | 2013 | Belgian Grand Prix | Mercedes |

```
[49]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      ↳((FinalData['surname'] == 'Massa'))].sort_values(by=['surname', 'name_x']).
      ↳head(6)
```

```
[49]: Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
514          514      22519      4              2          47.0          01:44.8
995          995      22071      7              8          52.0          01:45.4
971          971      21715      4              4          38.0          01:30.2
497          497      22287      1              4          63.0          01:12.6
493          493      22180      7              7          40.0          01:39.3
976          976      21792      4             15          42.0          01:38.8
```

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|-----|-----------------|---------|----------|------|-----------------------|----------|
| 514 | 190.738 | Massa | Finished | 2014 | Abu Dhabi Grand Prix | Williams |
| 995 | 189.615 | Massa | Finished | 2013 | Abu Dhabi Grand Prix | Ferrari |
| 971 | 211.558 | Massa | Finished | 2013 | Australian Grand Prix | Ferrari |
| 497 | 214.553 | Massa | Finished | 2014 | Austrian Grand Prix | Williams |
| 493 | 196.26 | Massa | Finished | 2014 | Bahrain Grand Prix | Williams |
| 976 | 197.12 | Massa | Finished | 2013 | Bahrain Grand Prix | Ferrari |

```
[62]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      ↳((FinalData['surname'] == 'Button'))].sort_values(by=['surname', 'name_x']).
      ↳head(6)
```

```
[62]: Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
169          169      22075      12             12          43.0          01:46.3
192          192      22522       6              5          47.0          01:46.7
148          148      21720      10              9          41.0          01:30.2
258          258      22132      10              3          39.0          01:32.9
176          176      22294      11             11          60.0          01:12.9
153          153      21787      10             10          49.0          01:37.7
```

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|-----|-----------------|---------|----------|------|-----------------------|---------|
| 169 | 188.03 | Button | Finished | 2013 | Abu Dhabi Grand Prix | McLaren |
| 192 | 187.32 | Button | Finished | 2014 | Abu Dhabi Grand Prix | McLaren |
| 148 | 211.654 | Button | Finished | 2013 | Australian Grand Prix | McLaren |
| 258 | 205.46 | Button | Finished | 2014 | Australian Grand Prix | McLaren |

| | | | | | | |
|-----|---------|--------|----------|------|---------------------|---------|
| 176 | 213.752 | Button | Finished | 2014 | Austrian Grand Prix | McLaren |
| 153 | 199.33 | Button | Finished | 2013 | Bahrain Grand Prix | McLaren |

```
[65]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      →((FinalData['surname'] == 'Ricciardo'))].
      →sort_values(by=['surname', 'name_x']).head(6)
```

```
[65]: Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
1519          1519    22521    20                4         50.0         01:44.5
1500          1500    22291     5                8         55.0         01:13.1
1494          1494    22177    13                4         38.0         01:39.3
1640          1640    22373     5                1         44.0         01:53.0
1774          1774    21941    19               10         38.0         01:51.0
1502          1502    22308     8                3         34.0         01:38.5
```

| | fastestLapSpeed | surname | status | year | name_x | \ |
|------|-----------------|-----------|----------|------|----------------------|---|
| 1519 | 191.341 | Ricciardo | Finished | 2014 | Abu Dhabi Grand Prix | |
| 1500 | 213.161 | Ricciardo | Finished | 2014 | Austrian Grand Prix | |
| 1494 | 196.266 | Ricciardo | Finished | 2014 | Bahrain Grand Prix | |
| 1640 | 223.187 | Ricciardo | Finished | 2014 | Belgian Grand Prix | |
| 1774 | 227.224 | Ricciardo | Finished | 2013 | Belgian Grand Prix | |
| 1502 | 215.395 | Ricciardo | Finished | 2014 | British Grand Prix | |

| | name_y |
|------|------------|
| 1519 | Red Bull |
| 1500 | Red Bull |
| 1494 | Red Bull |
| 1640 | Red Bull |
| 1774 | Toro Rosso |
| 1502 | Red Bull |

```
[71]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      →((FinalData['surname'] == 'Bottas'))].sort_values(by=['surname', 'name_x']).
      →head(6)
```

```
[71]: Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
515          515    22520     3                3         54.0         01:45.7
611          611    22134    15                5         56.0         01:32.6
498          498    22286     2                3         63.0         01:12.6
476          476    21791    15               14         57.0         01:38.2
494          494    22181     3                8         50.0         01:39.8
481          481    21946    20               15         31.0         01:52.7
```

| | fastestLapSpeed | surname | status | year | name_x | name_y |
|-----|-----------------|---------|----------|------|-----------------------|----------|
| 515 | 189.113 | Bottas | Finished | 2014 | Abu Dhabi Grand Prix | Williams |
| 611 | 206.128 | Bottas | Finished | 2014 | Australian Grand Prix | Williams |
| 498 | 214.568 | Bottas | Finished | 2014 | Austrian Grand Prix | Williams |
| 476 | 198.419 | Bottas | Finished | 2013 | Bahrain Grand Prix | Williams |
| 494 | 195.296 | Bottas | Finished | 2014 | Bahrain Grand Prix | Williams |

481 223.754 Bottas Finished 2013 Belgian Grand Prix Williams

```
[73]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      ↳((FinalData['surname'] == 'Hamilton'))].sort_values(by=['surname', 'name_x']).
      ↳head(6)
```

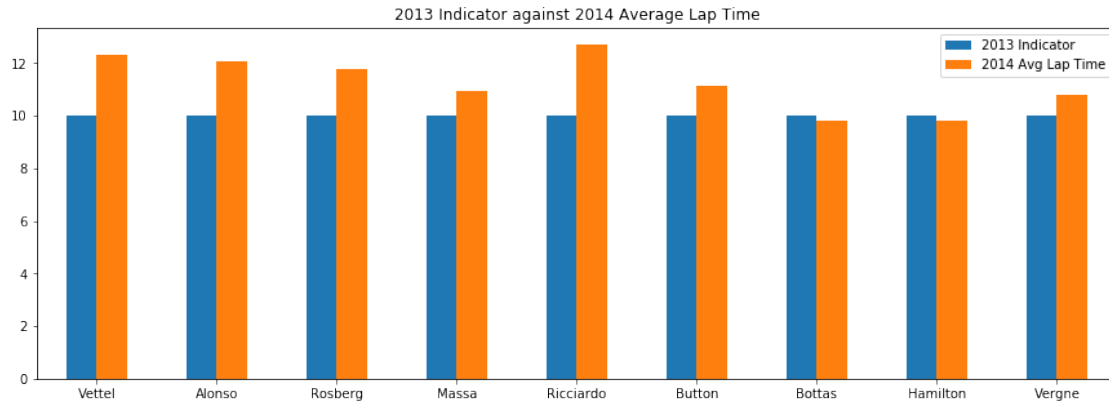
```
[73]:      Unnamed: 0  resultId  grid  positionOrder  fastestLap  fastestLapTime  \
2155      2155      22070      4              7        47.0         01:45.5
2189      2189      22518      2              1        49.0         01:45.6
2130      2130      21716      3              5        45.0         01:29.8
2171      2171      22285      9              2        41.0         01:12.2
2134      2134      21782      9              5        48.0         01:38.2
2163      2163      22174      2              1        49.0         01:37.1
```

```
      fastestLapSpeed  surname  status  year  name_x  \
2155      189.586  Hamilton  Finished  2013  Abu Dhabi Grand Prix
2189      189.342  Hamilton  Finished  2014  Abu Dhabi Grand Prix
2130      212.689  Hamilton  Finished  2013  Australian Grand Prix
2171      215.65   Hamilton  Finished  2014  Austrian Grand Prix
2134      198.395  Hamilton  Finished  2013  Bahrain Grand Prix
2163      200.634  Hamilton  Finished  2014  Bahrain Grand Prix
```

```
      name_y
2155  Mercedes
2189  Mercedes
2130  Mercedes
2171  Mercedes
2134  Mercedes
2163  Mercedes
```

```
[157]: # The chart below signifies a 2014 average lap time versus a 2013 indicator
      ↳time.
Initial = [10,10,10,10, 10, 10, 10, 10, 10]
SpeedIn2014 = [12.29, 12.07, 11.78, 10.92, 12.71, 11.12, 9.79, 9.82, 10.77]
index = ['Vettel', 'Alonso', 'Rosberg', 'Massa', 'Ricciardo', 'Button',
      ↳'Bottas', 'Hamilton', 'Vergne']
df = pd.DataFrame({'2013 Indicator': Initial, '2014 Avg Lap Time':
      ↳SpeedIn2014}, index=index)
df.plot.bar(rot=0, figsize=(15,5), title = '2013 Indicator against 2014 Average
      ↳Lap Time')
```

```
[157]: <matplotlib.axes._subplots.AxesSubplot at 0x1c225a6198>
```



The reason for the cars being slower than last year:
<https://bleacherreport.com/articles/2003467-are-2014-formula-1-cars-slower-analysing-lap-times-at-australian-grand-prix>

0.9 Linear Regression

using linear regression to figure out the correlation between Grid Position and Final Position.

[182]: *# Trying to check the correlation between Final Position and Grid Position.*

```
from sklearn.model_selection import train_test_split
from sklearn.linear_model import LinearRegression
from sklearn import metrics

# Using grid as X and position as y
X = FinalData['grid'].values.reshape(-1,1)
y = FinalData['positionOrder'].values.reshape(-1,1)

# Splitting the Data set
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size = 0.2,
→random_state = 0)

regressor = LinearRegression()
regressor.fit(X_train, y_train)
```

[182]: `LinearRegression(copy_X=True, fit_intercept=True, n_jobs=None, normalize=False)`

[165]: `print(regressor.intercept_)`
`print(regressor.coef_)`

```
[2.49616411]
[[0.45764567]]
```

[186]: `y_pred = regressor.predict(X_test)`

```

predictions = pd.DataFrame({'Actual': y_test.flatten(), 'Predicted' : y_pred.
    ↳flatten()})
predictions

# Actual Position vs Predicted.

```

```

[186]:
    Actual Predicted
0         2   2.953810
1         8   8.445558
2         5   5.242038
3         5   5.699684
4         4   5.242038
5         4   4.326747
6         1   3.411455
7         8   7.987912
8         9   6.157329
9        10   6.614975
10        5   4.784392
11        5   4.326747
12        6   7.072621
13        4   4.326747
14        2   4.326747
15        8   7.072621
16        2   2.953810
17        3   3.869101
18        1   3.411455
19        7   7.987912
20        2   5.242038
21        3   3.411455
22        2   4.326747
23        10   7.987912
24        8   7.530266
25        8   7.072621
26        4   6.614975
27        5   7.530266
28        5   9.360849
29        1   4.326747
..      ...      ...
491        9   7.987912
492       19  11.191432
493        3   5.242038
494        5   5.242038
495        6   5.242038
496        4   5.242038
497        2   4.784392
498        2   3.869101
499        1   2.953810

```

```

500      3    5.699684
501      2    3.411455
502      3    5.242038
503      8    5.699684
504      9    8.903203
505      1    2.953810
506      5    4.326747
507     12    7.530266
508     11   10.733786
509      6    8.445558
510      7    3.411455
511      7    3.411455
512      4    4.326747
513     14    8.903203
514      8    7.072621
515      2    3.411455
516      2    3.411455
517      6    5.242038
518      1    2.953810
519      5    3.411455
520      8    6.157329

```

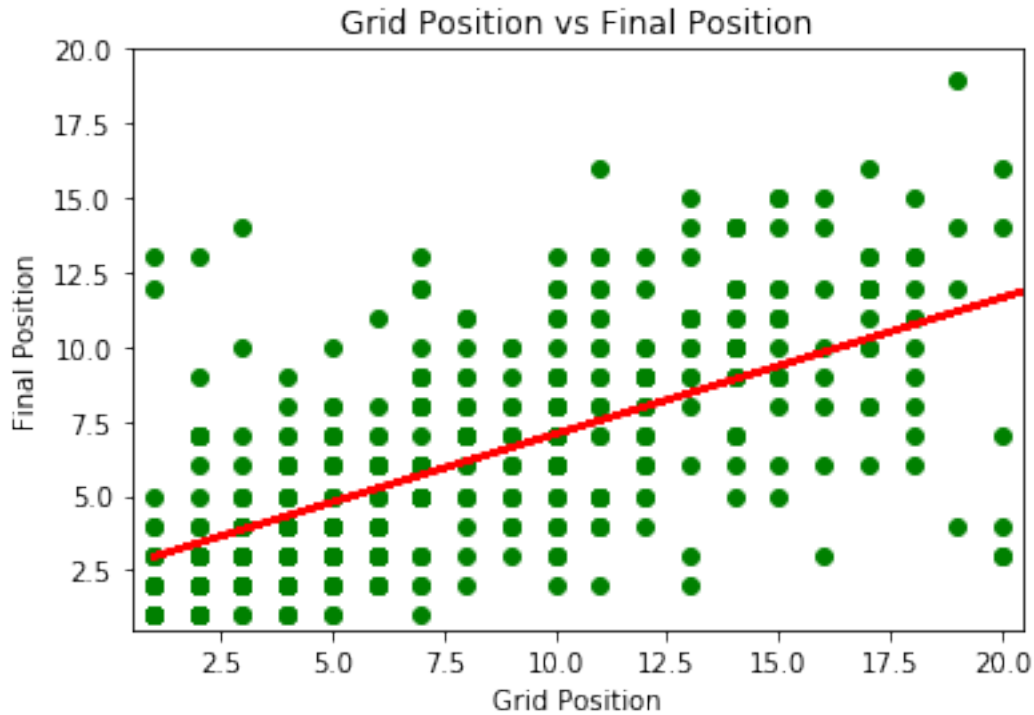
```
[521 rows x 2 columns]
```

```

[245]: # The problem with using a scatter plot to visualize this data is that there
      ↪are only a certain amount of positions
      # that drivers can finish.. Between 1 and 20. That means that the graph will be
      ↪very uniform.
      plt.scatter(X_test, y_test, color='green')
      plt.plot(X_test, y_pred, color = 'red', linewidth = 2)
      plt.title('Grid Position vs Final Position')
      plt.xlabel('Grid Position')
      plt.ylabel('Final Position')
      plt.ylim(0.5, 20)
      plt.xlim(0.5, 20.5)
      plt.show

```

```
[245]: <function matplotlib.pyplot.show(*args, **kw)>
```

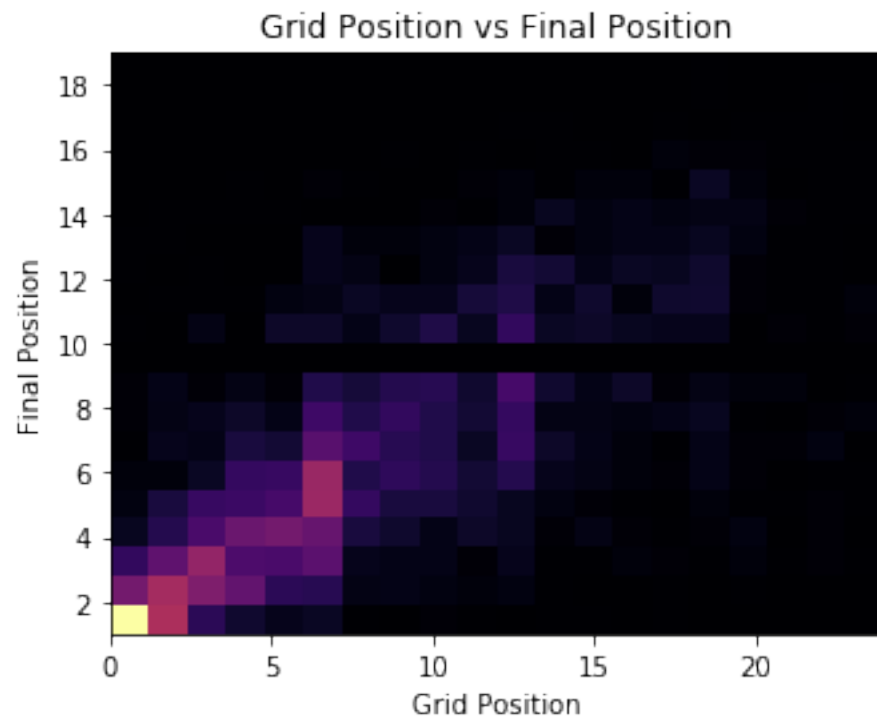


```
[247]: # Instead I decided to use a heatmap in order to show each block a little more
        ↪clear. Allows us to see the amount of
        # drivers instead of just a green dot.

import numpy as np
import numpy.random
import matplotlib.pyplot as plt

heatmap, xedges, yedges = np.histogram2d(FinalData['grid'],
        ↪FinalData['positionOrder'], bins=(20))
extent = [xedges[0], xedges[-1], yedges[0], yedges[-1]]

plt.clf()
plt.imshow(heatmap.T, extent=extent, origin='lower', cmap='inferno')
plt.title('Grid Position vs Final Position')
plt.xlabel('Grid Position')
plt.ylabel('Final Position')
plt.ylim(1)
plt.xlim(0)
plt.show()
```

[]: