Project_SZ

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0.1 Project for COMP 499 - Data Analytics

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Questions: I will be examining the changes to the car in order to determine if these changes have a direct impact on faster laptimes the following year. 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 Laptimes 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 \
                                                         22.0
     0
                1
                       18
                                   1
                                                    1
                                                                   1
                                                                            1.0
     1
                2
                       18
                                   2
                                                    2
                                                          3.0
                                                                   5
                                                                            2.0
     2
                3
                                   3
                                                    3
                                                          7.0
                                                                   7
                       18
                                                                            3.0
     3
                4
                       18
                                   4
                                                    4
                                                          5.0
                                                                            4.0
                                                                  11
     4
                5
                       18
                                   5
                                                    1
                                                         23.0
                                                                   3
                                                                            5.0
                      positionOrder
                                      points
                                                               milliseconds \
       positionText
                                              laps
                                                         time
     0
                   1
                                    1
                                         10.0
                                                  58
                                                      34:50.6
                                                                   5690616.0
                   2
                                   2
                                          8.0
                                                  58
                                                        5.478
                                                                   5696094.0
     1
     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
                                                       18.014
                                                  58
                                                                   5708630.0
        fastestLap rank fastestLapTime fastestLapSpeed statusId
     0
               39.0
                      2.0
                                  01:27.5
                                                      218.3
               41.0
                      3.0
                                                                     1
     1
                                  01:27.7
                                                    217.586
     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
[16]: results['fastestLapTime']
[16]: 0
               01:27.5
     1
               01:27.7
     2
               01:28.1
     3
               01:28.6
               01:27.4
     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
                   {\tt 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
         01:40.7
23757
         01:41.5
23758
         01:40.8
23759
23760
         01:42.3
23761
         01:42.0
23762
         01:42.4
         01:42.7
23763
23764
         01:42.6
23765
         01:43.4
23766
         01:43.0
23767
         01:42.4
23768
         01:44.0
         01:43.9
23769
23770
         01:43.9
23771
         01:43.9
23772
         01:43.8
23773
         01:43.6
23774
         01:42.3
23775
         01:43.4
         01:42.8
23776
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 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 | positionOrde | r points | laps | \ |
| coun | t 23777.000000 | 13227.000000 | 23777.00000 | 0 23777.000000 | 23777.000000 | |
| mean | 11.270303 | 7.782264 | 13.08159 | 1 1.601403 | 45.270598 | |
| std | 7.346436 | 4.745105 | 7.82471 | 1 3.665154 | 30.525404 | |
| min | 0.000000 | 1.000000 | 1.00000 | 0.000000 | 0.000000 | |
| 25% | 5.000000 | 4.000000 | 7.00000 | 0.000000 | 20.000000 | |
| 50% | 11.000000 | 7.000000 | 13.00000 | 0.000000 | 52.000000 | |
| 75% | 17.000000 | 11.000000 | 19.00000 | 0 1.000000 | 66.000000 | |
| max | 34.000000 | 33.000000 | 39.00000 | 0 50.000000 | 200.000000 | |
| | | | | | | |
| | milliseconds | fastestLap | rank | statusId | | |
| coun | t 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 ${\tt positionOrder}$ 23777 points 23777 laps 23777 time 6004 6003 milliseconds fastestLap5383 rank 5531 fastestLapTime 5383 ${\tt fastestLapSpeed}$ 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
                         10550
    position
    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
     results.isnull().sum()
[20]: resultId
                         0
     raceId
                         0
     driverId
                         0
     constructorId
                         0
     number
                         0
     grid
                         0
    position
                         0
    positionText
                         0
     positionOrder
                         0
                         0
    points
     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
               01:35.9
     23
     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
               01:34.2
     49
     50
               01:34.3
     51
               01:34.1
     52
               01:34.8
     53
               01:35.2
     54
               01:34.9
               01:21.7
     66
     67
               01:21.8
     68
               01:22.0
                . . .
     23684
               01:35.3
     23685
               01:35.3
     23697
               01:38.8
               01:38.8
     23698
     23699
               01:37.8
               01:38.1
     23700
     23701
               01:37.8
     23702
               01:40.5
     23703
               01:40.5
     23717
               01:18.9
     23718
               01:19.4
               01:20.1
     23719
               01:18.8
     23720
     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
              01:42.4
     23762
     23763
              01:42.7
              01:42.6
     23764
     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
                         2604
     statusId
     dtype: int64
       Our Results are all cleaned and ready to be used!
[24]: # Our Data Types
     results.dtypes
[24]: resultId
                           int64
                           int64
     raceId
     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 |
| ${\tt fastestLapTime}$ | object |
| ${\tt fastestLapSpeed}$ | object |
| statusId | int64 |
| 1. 1 | |

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**.

|]: re | sults.head | () | | | | | | | |
|-------|-------------|---------|-----------|---------|--------|---------|-------|-----------|---|
| 5]: | resultId | raceId | driverId | constru | ctorId | 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 | |
| | positionTe: | xt posi | tionOrder | points | laps | time | milli | seconds \ | |
| 0 | | 1 | 1 | 10.0 | 58 | 34:50.6 | 56 | 90616.0 | |
| 1 | | 2 | 2 | 8.0 | 58 | 5.478 | 56 | 96094.0 | |
| 2 | | 3 | 3 | 6.0 | 58 | 8.163 | 56 | 98779.0 | |
| 3 | | 4 | 4 | 5.0 | 58 | 17.181 | 57 | 07797.0 | |
| 4 | | 5 | 5 | 4.0 | 58 | 18.014 | 57 | 08630.0 | |

```
41.0
                       3.0
     1
                                   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
                                   01:27.4
                                                     218.385
                       1.0
[27]: # Reading the Drivers csv File
     drivers = pd.read_csv("./data/drivers.csv", encoding = "ISO-8859-1")
     drivers.head()
[27]:
        driverId
                     driverRef
                                                              surname
                                 number code
                                                forename
                                                                                dob
                1
                      hamilton
                                   44.0
                                          HAM
                                                   Lewis
                                                             Hamilton
                                                                        07/01/1985
                2
                                          HEI
     1
                      heidfeld
                                    NaN
                                                    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
                   kovalainen
                                          KOV
                                                           Kovalainen
                                                                        19/10/1981
                                    NaN
                                                  Heikki
       nationality
                                                                      url
                         http://en.wikipedia.org/wiki/Lewis_Hamilton
     0
            British
     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
            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
                                                                 22.0
                                                                           1
                   1
                            18
                                        1
                                                                                    1.0
                                                                           9
     1
                   27
                            19
                                        1
                                                         1
                                                                22.0
                                                                                    5.0
     2
                   69
                            21
                                        1
                                                         1
                                                                22.0
                                                                           5
                                                                                    3.0
                  90
                            22
                                                                22.0
     3
                                        1
                                                         1
                                                                           3
                                                                                    2.0
     4
                 109
                            23
                                        1
                                                         1
                                                                22.0
                                                                           3
                                                                                    1.0
     5
                            25
                                        1
                                                         1
                                                                22.0
                                                                          13
                                                                                   10.0
                  158
     6
                 169
                            26
                                        1
                                                         1
                                                                22.0
                                                                           4
                                                                                    1.0
     7
                            27
                                        1
                                                         1
                                                                22.0
                                                                                    1.0
                  189
                                                                           1
                                                         1
     8
                 213
                            28
                                        1
                                                                22.0
                                                                           1
                                                                                    5.0
     9
                 230
                            29
                                        1
                                                         1
                                                                22.0
                                                                           2
                                                                                    2.0
     10
                            30
                                        1
                                                         1
                                                                22.0
                                                                                    3.0
                 251
                                                                           1
                                                         1
     11
                 275
                            31
                                        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
                                                                22.0
     14
                 329
                            34
                                        1
                                                         1
                                                                           1
                                                                                    1.0
                                                         1
                                                                           4
     15
                 353
                            35
                                        1
                                                                22.0
                                                                                    5.0
     16
                 371
                                        1
                                                         1
                                                                 2.0
                                                                           4
                                                                                    3.0
                            36
     17
                 392
                            37
                                        1
                                                         1
                                                                 2.0
                                                                           4
                                                                                    2.0
                                        1
                                                         1
                                                                           2
                                                                                    2.0
     18
                 414
                            38
                                                                  2.0
     19
                 436
                            39
                                        1
                                                         1
                                                                 2.0
                                                                           4
                                                                                    2.0
                                        1
                                                         1
                                                                           2
     20
                 458
                            40
                                                                  2.0
                                                                                    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 | 2.0 | 1 | 3.0 |
| | | | 1 | | | | | |
| 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 | | 4 | 4.0 |
| | | | | | | 2.0 | | |
| 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 | | 942 | 834 | | 209 | 53.0 | 17 | 12.0 |
| | | | | | | | | |
| 2577 | | 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 | | 974 | 835 | | 4 | 30.0 | 16 | 11.0 |
| | | | | | 4 | | | |
| 2581 | 23614 | 980 | 835 | | | 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 | | 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 | | 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 | | 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 | | 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 | posi | tionOrder | points | f | fastestLapS | peed s | statusId \ |
| 0 | 1 | - | 1 | 10.0 | | _ | 18.3 | 1 |
| 1 | 5 | | 5 | 4.0 | | | .033 | 1 |
| | | | | | | | | |
| 2 | 3 | | 3 | 6.0 | • • • | | .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 |
| | | | | | | |

| OFOE | 16 | | 4 E | 0 0 | 176 | 420 | 4 |
|------|----------------|----------|------|-----------|------------------|--------------|---|
| 2595 | 15 | | 15 | 0.0 | | . 439 | 1 |
| 2596 | 10 | | 10 | 1.0 | | .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 | | .636 | 1 |
| | | | | | | | |
| 2602 | 14 | | 14 | 0.0 | | .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 | ${\tt Hamilton}$ | 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 | ${\tt Hamilton}$ | 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 | |
| 20.0 | Jory on Parmer | 50.0 | | 001y011 | 1 dimoi | _0, 01, 1001 | |

| 2579 | jolyon_palmer | 30.0 | PAL | Jolyon | Palmer | 20/01/1991 |
|------|--------------------------------|-----------|------------|----------------------------|-----------------|------------|
| 2580 | jolyon_palmer 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 | 000 | Esteban | Ocon | 17/09/1996 |
| 2585 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2586 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2587 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2588 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2589 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2590 | ocon | 31.0 | 0C0 | Esteban | Ocon | 17/09/1996 |
| 2591 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2592 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2593 | ocon | 31.0 | 000 | Esteban | Ocon | 17/09/1996 |
| 2594 | ocon | 31.0 | 000 | 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 |
| 2000 | vandoorne | 2.0 | VAIN | proffer | vandoorne | 20/00/1002 |
| | nationality | | | | | url |
| 0 | British | http:// | /en.wi | kipedia.org | /wiki/Lewis | |
| 1 | British | _ | | kipedia.org | | |
| 2 | British | - | | kipedia.org | | |
| 3 | British | - | | kipedia.org | | _ |
| 4 | British | - | | kipedia.org | | |
| 5 | British | - | | kipedia.org | | |
| 6 | British | - | | kipedia.org | | _ |
| 7 | British | - | | kipedia.org | | |
| 8 | British | - | | kipedia.org | | |
| 9 | British | - | | kipedia.org | | |
| 10 | British | _ | | kipedia.org | | |
| 11 | British | _ | | kipedia.org | | |
| 12 | British | - | | kipedia.org | | |
| 13 | British | - | | kipedia.org | | |
| 14 | British | - | | kipedia.org | | |
| 15 | British | _ | | kipedia.org kipedia.org | | |
| 16 | British | - | | kipedia.org kipedia.org | | |
| 17 | British | - | | kipedia.org kipedia.org | | |
| 18 | British | - | | kipedia.org kipedia.org | | |
| 19 | British | - | | kipedia.org kipedia.org | | |
| 10 | DITOIDII | 110 op.// | O11 . W 1. | "-beara.org | , "TTT TCM TO | |

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20
         British
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
21
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
         British
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
22
         British
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
23
         British
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                        http://en.wikipedia.org/wiki/Lewis_Hamilton
         British
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
25
         British
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                        http://en.wikipedia.org/wiki/Lewis Hamilton
         British
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
27
         British
28
                        http://en.wikipedia.org/wiki/Lewis Hamilton
         British
29
         British
                        http://en.wikipedia.org/wiki/Lewis_Hamilton
             . . .
. . .
         Spanish
                      http://en.wikipedia.org/wiki/Carlos_Sainz_Jr.
2574
2575
         Spanish
                      http://en.wikipedia.org/wiki/Carlos_Sainz_Jr.
2576
        American
                  http://en.wikipedia.org/wiki/Alexander_Rossi_%...
2577
                         http://en.wikipedia.org/wiki/Jolyon_Palmer
         British
2578
         British
                         http://en.wikipedia.org/wiki/Jolyon_Palmer
                         http://en.wikipedia.org/wiki/Jolyon_Palmer
2579
         British
2580
                         http://en.wikipedia.org/wiki/Jolyon_Palmer
         British
                         http://en.wikipedia.org/wiki/Jolyon_Palmer
2581
         British
2582
                         http://en.wikipedia.org/wiki/Jolyon_Palmer
         British
2583
                          http://en.wikipedia.org/wiki/Esteban_Ocon
          French
2584
                          http://en.wikipedia.org/wiki/Esteban Ocon
          French
2585
                          http://en.wikipedia.org/wiki/Esteban_Ocon
          French
2586
                          http://en.wikipedia.org/wiki/Esteban Ocon
          French
2587
          French
                          http://en.wikipedia.org/wiki/Esteban_Ocon
2588
          French
                          http://en.wikipedia.org/wiki/Esteban_Ocon
          French
                          http://en.wikipedia.org/wiki/Esteban_Ocon
2589
2590
          French
                          http://en.wikipedia.org/wiki/Esteban_Ocon
                          http://en.wikipedia.org/wiki/Esteban_Ocon
2591
          French
2592
                          http://en.wikipedia.org/wiki/Esteban_Ocon
          French
2593
          French
                          http://en.wikipedia.org/wiki/Esteban_Ocon
2594
                          http://en.wikipedia.org/wiki/Esteban_Ocon
          French
                       http://en.wikipedia.org/wiki/Pascal_Wehrlein
2595
          German
                       http://en.wikipedia.org/wiki/Pascal_Wehrlein
2596
          German
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
         Belgian
                     http://en.wikipedia.org/wiki/Stoffel_Vandoorne
2602
         Belgian
                     http://en.wikipedia.org/wiki/Stoffel_Vandoorne
2603
```

[2604 rows x 26 columns]

```
[31]: # Let's drop columns we don't need to clean it up a little bit. This is me<sub>□</sub>

→ testing dropping 'points' so that I dont

# screw up
```

```
merge = merge.drop('points', axis = 1)
     merge.head()
[31]:
                  raceId
                          driverId
                                     constructorId
                                                    number_x grid
        resultId
                                                                    position \
                      18
                                                        22.0
                                                                  1
               1
                                  1
                                                 1
                                                                          1.0
     0
              27
                      19
                                                        22.0
                                                                  9
                                                                          5.0
     1
                                  1
                                                 1
     2
              69
                      21
                                                        22.0
                                                                  5
                                                                          3.0
                                  1
                                                 1
     3
              90
                      22
                                                        22.0
                                                                  3
                                                                          2.0
                                  1
                                                 1
             109
                      23
                                  1
                                                 1
                                                        22.0
                                                                          1.0
       positionText
                     positionOrder
                                     laps
                                           ... fastestLapSpeed
                                                                statusId driverRef
                  1
                                                         218.3
                                                                        1
                                                                            hamilton
     0
                                       58
     1
                  5
                                 5
                                       56
                                                       209.033
                                                                        1
                                                                            hamilton
                  3
     2
                                  3
                                                       204.323
                                                                        1
                                                                            hamilton
                                       66
                  2
                                  2
     3
                                       58
                                                       222.085
                                                                            hamilton
     4
                  1
                                  1
                                       76
                                                       153.152
                                                                            hamilton
                                           . . .
                                                  dob nationality \
        number_y code forename
                                 surname
     0
            44.0
                  HAM
                         Lewis
                                Hamilton
                                           07/01/1985
                                                           British
            44.0
                  HAM
                                           07/01/1985
     1
                         Lewis
                                Hamilton
                                                           British
     2
            44.0
                  HAM
                         Lewis
                                Hamilton
                                           07/01/1985
                                                           British
     3
            44.0
                  MAH
                         Lewis
                                Hamilton 07/01/1985
                                                           British
            44.0
                  MAH
                                Hamilton 07/01/1985
                                                           British
                         Lewis
      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,
      \rightarrow number_y'
     merge = merge.drop(['position', 'laps', 'url', 'nationality', 'dob', u
      merge.head()
[32]:
        resultId raceId
                          driverId constructorId
                                                    number_x grid positionText
                                                        22.0
     0
               1
                      18
              27
                                                        22.0
                                                                  9
                                                                               5
     1
                      19
                                  1
     2
              69
                      21
                                  1
                                                 1
                                                        22.0
                                                                  5
                                                                               3
     3
              90
                      22
                                  1
                                                 1
                                                        22.0
                                                                  3
                                                                               2
                                                        22.0
     4
             109
                      23
                                  1
                                                 1
                                                                  3
                                                                               1
        positionOrder
                          time
                                milliseconds
                                               fastestLap rank fastestLapTime \
     0
                                                     39.0
                                                             2.0
                                                                        01:27.5
                       34:50.6
                                    5690616.0
```

```
46.548
                                                             3.0
     1
                    5
                                    5525103.0
                                                      53.0
                                                                         01:35.5
                         4.187
     2
                    3
                                    5903238.0
                                                      20.0
                                                             3.0
                                                                         01:22.0
     3
                          3.779
                                                             2.0
                                                                         01:26.5
                    2
                                    5213230.0
                                                      31.0
     4
                       00:42.7
                                                      71.0
                                                             6.0
                                                                         01:18.5
                                    7242742.0
       fastestLapSpeed statusId driverRef
                                              surname
     0
                 218.3
                                   hamilton Hamilton
                                1
     1
               209.033
                                   hamilton Hamilton
     2
               204.323
                                  hamilton Hamilton
     3
               222.085
                                   hamilton Hamilton
     4
                                1 hamilton Hamilton
               153.152
[33]: # reading the status csv file
     status = pd.read_csv("./data/status.csv", encoding = "ISO-8859-1")
     status.head()
[33]:
        statusId
                         status
               1
                      Finished
     1
               2
                  Disqualified
               3
                       Accident
     2
               4
     3
                     Collision
               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
                                     constructorId
                          driverId
                                                    number_x grid positionText
                       18
                                                         22.0
               1
                                                         22.0
                                                                                5
     1
              27
                      19
                                  1
                                                  1
     2
              69
                      21
                                  1
                                                  1
                                                         22.0
                                                                                3
              90
                      22
                                                         22.0
                                                                  3
                                                                                2
     3
                                  1
                                                  1
             109
                      23
                                  1
                                                  1
                                                         22.0
                                                                  3
                                                                                1
                                 milliseconds fastestLap rank fastestLapTime \
        positionOrder
                           time
     0
                                                      39.0
                                                             2.0
                                                                         01:27.5
                       34:50.6
                                    5690616.0
                                                             3.0
                    5
                        46.548
                                    5525103.0
                                                      53.0
                                                                         01:35.5
     1
     2
                    3
                          4.187
                                    5903238.0
                                                      20.0
                                                             3.0
                                                                         01:22.0
     3
                          3.779
                                    5213230.0
                                                      31.0
                                                             2.0
                                                                         01:26.5
                    2
                    1
                       00:42.7
                                    7242742.0
                                                      71.0
                                                             6.0
                                                                         01:18.5
                        statusId driverRef
       fastestLapSpeed
                                              surname
                                                          status
     0
                 218.3
                                1 hamilton Hamilton Finished
     1
               209.033
                                   hamilton Hamilton Finished
     2
               204.323
                                1 hamilton Hamilton Finished
     3
               222.085
                                1 hamilton Hamilton Finished
                                1 hamilton Hamilton Finished
               153.152
```

```
[38]: # droping 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
                                              22.0
               1
                      18
                                       1
                                                       1
              27
                                              22.0
                                                       9
                                                                    5
     1
                      19
                                      1
                                                                    3
     2
              69
                      21
                                       1
                                              22.0
                                                       5
                                                                    2
     3
              90
                      22
                                      1
                                              22.0
                                                       3
     4
                      23
                                              22.0
             109
                                       1
                                                                     1
        positionOrder
                                milliseconds fastestLap rank fastestLapTime \
                          time
     0
                    1
                       34:50.6
                                    5690616.0
                                                     39.0
                                                            2.0
                                                                        01:27.5
                        46.548
                                                            3.0
                                                                        01:35.5
                    5
                                    5525103.0
                                                     53.0
     1
     2
                    3
                         4.187
                                                     20.0
                                                            3.0
                                                                       01:22.0
                                   5903238.0
                                                                       01:26.5
     3
                    2
                         3.779
                                    5213230.0
                                                     31.0
                                                            2.0
     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
               222.085 Hamilton Finished
     3
               153.152 Hamilton Finished
[40]: # reading races csv, droping 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
                2009
                     Australian Grand Prix
             1
     1
             2 2009
                       Malaysian Grand Prix
             3 2009
                         Chinese Grand Prix
     3
             4 2009
                         Bahrain Grand Prix
             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()
                          constructorId number_x grid positionText
[41]:
        resultId raceId
               1
                      18
                                      1
                                              22.0
                                                                     1
               2
                      18
                                      2
                                               3.0
                                                       5
                                                                    2
     1
     2
               3
                      18
                                      3
                                               7.0
                                                       7
                                                                    3
     3
               4
                      18
                                       4
                                               5.0
                                                      11
                                                                    4
     4
               5
                                       1
                                              23.0
                      18
                                                       3
        positionOrder
                          time milliseconds fastestLap rank fastestLapTime \
```

```
0
                      34:50.6
                                  5690616.0
                                                   39.0
                                                          2.0
                                                                     01:27.5
                    2
                                                   41.0
                                                          3.0
                                                                     01:27.7
    1
                        5.478
                                  5696094.0
    2
                   3
                        8.163
                                  5698779.0
                                                   41.0
                                                          5.0
                                                                     01:28.1
    3
                       17.181
                                                          7.0
                   4
                                  5707797.0
                                                   58.0
                                                                     01:28.6
                   5
                       18.014
                                                   43.0
                                                          1.0
                                                                     01:27.4
                                  5708630.0
      fastestLapSpeed
                                                                    name
                          surname
                                     status
                                             year
    0
                218.3
                         Hamilton Finished
                                             2008
                                                   Australian Grand Prix
              217.586
    1
                         Heidfeld Finished
                                             2008
                                                   Australian Grand Prix
    2
               216.719
                          Rosberg Finished
                                                   Australian Grand Prix
                                             2008
                                                   Australian Grand Prix
    3
               215.464
                           Alonso Finished
                                             2008
               218.385 Kovalainen Finished 2008
                                                   Australian Grand Prix
[47]: # reading constructor csv, droping columns: constructorRef, nationality, url,
     \rightarrowsaving it to d2.
    constructors = pd.read_csv("./data/constructors.csv", encoding = "ISO-8859-1")
    \rightarrow 'Unnamed: 5'], axis = 1)
    d2 = pd.merge(cleanedData, constructors, how='inner', on = 'constructorId')
    d2.head()
[47]:
       resultId raceId constructorId number_x grid positionText
              1
                     18
                                     1
                                            22.0
                                                     1
                                                                   1
                                            23.0
              5
                                                                  5
    1
                     18
                                     1
                                                     3
    2
             27
                     19
                                     1
                                            22.0
                                                     9
                                                                  5
                                                                  3
    3
             25
                     19
                                     1
                                            23.0
                                                     8
    4
             69
                                            22.0
                                                     5
                                                                  3
                     21
                                     1
                               milliseconds fastestLap rank fastestLapTime \
       positionOrder
                         time
                                                          2.0
    0
                      34:50.6
                                  5690616.0
                                                   39.0
                                                                     01:27.5
                    1
    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
                                                   19.0
                                                          7.0
                                                                     01:35.9
    3
                   3
                        38.45
                                  5517005.0
                   3
                        4.187
                                  5903238.0
                                                   20.0
                                                          3.0
                                                                     01:22.0
      fastestLapSpeed
                          surname
                                     status
                                             year
                                                                  name x
                                                                           name_y
                                                   Australian Grand Prix McLaren
                 218.3
    0
                         Hamilton Finished
                                             2008
    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
               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 \
                       1
                 1
                                               39.0
                                                           01:27.5
                                       1
```

| 4 | _ | 0 | - | 40.0 | 04 07 4 |
|------|------|----|-------|------|-----------|
| 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 | 01:19.0 |
| | | | 5 | | |
| 24 | 353 | 4 | | 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 | | | |
| | | | | | | | | |
| | ${\tt fastestLapSpeed}$ | surname | status | year | | na | me_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 | | | |
| 3 | 208.031 | Kovalainen | | 2008 | Malaysian | | | |
| 4 | 204.323 | Hamilton | | 2008 | Spanish | | | |
| 5 | 222.085 | Hamilton | | 2008 | Turkish | | | |
| 6 | 153.152 | Hamilton | Finished | 2008 | | Grand : | | |
| 7 | 155.586 | Kovalainen | Finished | 2008 | | Grand : | | |
| 8 | 205.022 | Hamilton | Finished | 2008 | | Grand : | | |
| 9 | 205.87 | Kovalainen | Finished | 2008 | | Grand : | | |
| 10 | 199.398 | Hamilton | Finished | 2008 | British | | | |
| 11 | 216.552 | Hamilton | Finished | 2008 | | Grand : | | |
| 12 | 215.261 | Kovalainen | | 2008 | | Grand : | | |
| 13 | 193.533 | Hamilton | | 2008 | Hungarian | | | |
| 14 | 192.917 | Kovalainen | | 2008 | Hungarian | | | |
| 15 | 197.285 | Hamilton | | 2008 | European | | | |
| 16 | 196.831 | Kovalainen | Finished | 2008 | European | | | |
| 17 | 233.175 | | Finished | 2008 | Belgian | | | |
| 18 | 232.44 | Hamilton | Finished | 2008 | Italian | | | |
| 19 | 230.95 | Kovalainen | Finished | 2008 | Italian | | | |
| 20 | 171.969 | Hamilton | Finished | 2008 | Singapore | | | |
| 21 | 169.943 | Kovalainen | Finished | 2008 | Singapore | | | |
| 22 | 206.47 | Hamilton | | 2008 | Japanese | | | |
| 23 | 203.722 | Hamilton | | 2008 | Chinese | | | |
| 24 | 209.177 | Hamilton | | 2008 | Brazilian | | | |
| 25 | 209.042 | Kovalainen | Finished | 2008 | Brazilian | | | |
| 26 | 221.083 | Hamilton | Finished | 2007 | Australian | | | |
| 27 | 221.178 | Alonso | Finished | 2007 | Australian | | | |
| 28 | 206.355 | Hamilton | Finished | 2007 | Malaysian | | | |
| 29 | 206.014 | Alonso | Finished | 2007 | Malaysian | Grand . | rrix | |
| 2574 | 01/1 202 | Pu++on | Finiahad | 2004 | Dah | Crard | Dr: | |
| 2574 | 214.393 | Button | Finished | 2004 | Bahrain | Grand . | LLIX | |

| 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
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      McLaren
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25
      McLaren
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      McLaren
27
      McLaren
28
      McLaren
29
      {\tt McLaren}
. . .
           . . .
2574
           BAR
2575
           BAR
2576
           BAR
2577
           BAR
2578
           BAR
2579
           {\tt BAR}
2580
           BAR
2581
           BAR
2582
           BAR
2583
           BAR
2584
           BAR
           BAR
2585
2586
           BAR
2587
           BAR
2588
           BAR
2589
           BAR
2590
           BAR
2591
           BAR
2592
           BAR
2593
           BAR
2594
           BAR
2595
       Jordan
2596
        Jaguar
2597
        Jaguar
        Jaguar
2598
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_
      \hookrightarrow happens.
[55]: # No Nulls Found, so all my data is cleaned.
     FinalData.isnull().sum()
[55]: resultId
                          0
     grid
                          0
     positionOrder
                          0
                          0
     fastestLap
     fastestLapTime
                          0
     fastestLapSpeed
                          0
     surname
                          0
     status
                          0
     year
                          0
                          0
     name x
                          0
     name_y
     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
                                                       8
     1843
                  1843
                            22269
                                       8
                                                                 56.0
                                                                              01:19.4
                                                       2
     2187
                  2187
                            22501
                                       2
                                                                 62.0
                                                                              01:13.6
     2104
                  2104
                            21068
                                       8
                                                       5
                                                                 46.0
                                                                              01:27.4
     102
                            20854
                                       6
                                                       6
                                                                 47.0
                                                                              01:31.2
                   102
     2542
                  2542
                            23346
                                      22
                                                      12
                                                                 47.0
                                                                              01:27.8
     1119
                  1119
                              722
                                       1
                                                       2
                                                                 71.0
                                                                              01:12.6
     2480
                                                                 45.0
                  2480
                            21964
                                      11
                                                      11
                                                                              01:26.9
                                       6
                                                       2
                                                                 46.0
     2067
                  2067
                             7795
                                                                              01:24.9
                                                       7
                                                                 44.0
     950
                   950
                            21310
                                       9
                                                                              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
                                       5
                                                       7
                                                                 55.0
                                                                              01:18.4
                              315
                                       5
                                                       4
     432
                   432
                             7737
                                                                 65.0
                                                                              01:22.5
                                       7
     1631
                  1631
                            21554
                                                                 53.0
                                                                              01:53.7
                                                      11
     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
                                   Glock Finished 2008
                                                              Brazilian Grand Prix
     1273
                   209.465
```

| 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 | RÌ_ikkÌęnen | 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 | HÌ_lkenberg | 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 likelyness 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)].
      \rightarrowshape[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)].
      \rightarrowshape[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)].
      \rightarrowshape [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)].
      \Rightarrowshape[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)].
      \Rightarrowshape [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)].
      \rightarrowshape [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)].
      \rightarrowshape [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['grid'] == 1) & (FinalData['positionOrder'] ==__
      \rightarrowi)].shape[0])
    140
    45
    23
    8
    4
    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['grid'] == 2) & (FinalData['positionOrder'] ==__
      \rightarrowi)].shape[0])
    65
    62
    38
    19
    15
    3
    7
    5
    6
    0
    1
    0
    1
    1
```

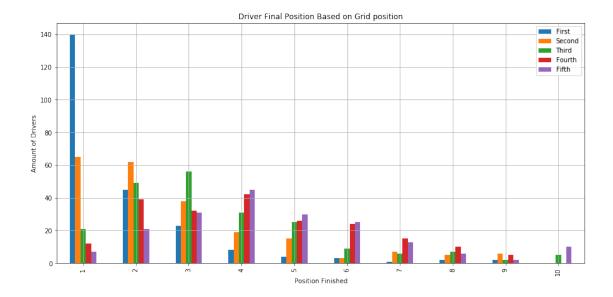
```
[95]: # Simple automation for finding data for my bar chart
      # Third Place on Grid:
      for i in range(1,15):
          print(FinalData['grid'] == 3) & (FinalData['positionOrder'] ==__
       \rightarrowi)].shape[0])
     21
     49
     56
     31
     25
     9
     6
     7
     2
     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['grid'] == 4) & (FinalData['positionOrder'] ==__
       \rightarrowi)].shape[0])
     12
     39
     32
     42
     26
     24
     15
     10
     5
     0
     1
     0
     0
[120]: # Simple automation for finding data for my bar chart
      # Fifth Place on Grid:
      for i in range(1,15):
          print(FinalData['grid'] == 5) & (FinalData['positionOrder'] ==__
       \rightarrowi)].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['grid'] == 6) & (FinalData['positionOrder'] ==__
       \rightarrowi)].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['grid'] == 7) & (FinalData['positionOrder'] ==__
       \rightarrowi)].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', u

→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_
       \hookrightarrowSymmetrix 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)].
       \rightarrowshape [0] /230*100
 [76]: 60.86956521739131
 [78]: FinalData[(FinalData['grid'] == 1) & (FinalData['positionOrder'] == 2)].
       \rightarrowshape [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)].
       \Rightarrowshape [0] /230*100
 [71]: 26.956521739130434
 [72]: FinalData[(FinalData['grid'] == 2) & (FinalData['positionOrder'] == 3)].
       \rightarrowshape [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

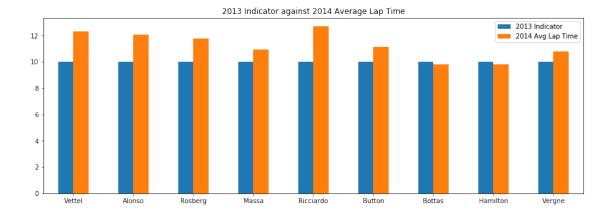
```
[39]: # Checking the Driver's average lap time Below
[41]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      \rightarrowhead(6)
[41]:
           Unnamed: 0
                       resultId
                                  grid
                                        positionOrder
                                                       fastestLap fastestLapTime
     1487
                 1487
                           22064
                                     2
                                                              51.0
                                                                          01:43.9
                                                     1
                                                     8
     1518
                 1518
                          22525
                                    19
                                                              51.0
                                                                          01:45.6
                                                     3
                                                              42.0
     1464
                 1464
                          21714
                                     1
                                                                          01:30.4
     1469
                                     2
                                                     1
                                                              55.0
                 1469
                          21778
                                                                          01:37.0
                                                     6
     1493
                 1493
                          22179
                                    10
                                                              18.0
                                                                          01:39.3
     1480
                 1480
                          21932
                                     2
                                                              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
                                                        Bahrain Grand Prix
     1469
                  200.938
                           Vettel
                                    Finished
                                              2013
                                                                            Red Bull
     1493
                  196.181
                           Vettel
                                    Finished
                                              2014
                                                        Bahrain Grand Prix
                                                                            Red Bull
                           Vettel
     1480
                  227.657
                                   Finished
                                             2013
                                                        Belgian Grand Prix
                                                                            Red Bull
[43]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &__
      →((FinalData['surname'] == 'Alonso'))].sort_values(by=['surname', 'name x']).
      \rightarrowhead(6)
[43]:
           Unnamed: 0
                       resultId
                                        positionOrder
                                                        fastestLap fastestLapTime \
                                  grid
     994
                  994
                          22068
                                    10
                                                     5
                                                              55.0
                                                                          01:43.4
                                                     9
                                                                          01:47.4
     1021
                 1021
                           22526
                                     8
                                                              45.0
     970
                  970
                                     5
                                                     2
                                                              53.0
                                                                          01:29.6
                          21713
     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
                                              2013
                                                      Abu Dhabi Grand Prix
                           Alonso
                                    Finished
                                                                            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
                                                        Bahrain Grand Prix Ferrari
                  200.436
                           Alonso
                                   Finished
                                             2013
[38]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &__
      →((FinalData['surname'] == 'Rosberg'))].sort_values(by=['surname', 'name x']).
      \rightarrowhead(6)
[38]:
           Unnamed: 0
                       resultId
                                  grid
                                        positionOrder
                                                       fastestLap fastestLapTime
                           22066
                                                                          01:44.5
     2156
                 2156
                                     3
                                                     3
                                                              51.0
                          22130
                                                              19.0
     2313
                 2313
                                     3
                                                     1
                                                                          01:32.5
                          22284
                                     3
                                                     1
                                                              50.0
     2172
                 2172
                                                                          01:12.6
```

```
2135
                 2135
                           21786
                                                     9
                                                              48.0
                                                                           01:37.6
                                     1
                                                     2
                                                              49.0
     2164
                 2164
                           22175
                                     1
                                                                           01:37.0
     2146
                 2146
                           21935
                                     4
                                                              39.0
                                                                           01:51.6
          fastestLapSpeed
                           surname
                                                                                name_y
                                       status
                                               year
                                                                     name_x
                            Rosberg Finished
     2156
                   191.41
                                               2013
                                                       Abu Dhabi Grand Prix
                                                                             Mercedes
     2313
                  206.436
                                                2014
                                                     Australian Grand Prix
                           Rosberg
                                     Finished
                                                                              Mercedes
     2172
                  214.518
                           Rosberg Finished
                                               2014
                                                        Austrian Grand Prix Mercedes
                           Rosberg Finished
                                                         Bahrain Grand Prix Mercedes
     2135
                  199.647
                                               2013
                           Rosberg Finished
                                                         Bahrain Grand Prix
                                                                              Mercedes
     2164
                  200.816
                                                2014
                  225.971 Rosberg Finished
     2146
                                              2013
                                                         Belgian Grand Prix
[49]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      →((FinalData['surname'] == 'Massa'))].sort values(by=['surname', 'name x']).
      \rightarrowhead(6)
[49]:
          Unnamed: 0
                      resultId
                                 grid
                                       positionOrder
                                                       fastestLap fastestLapTime
                 514
                          22519
                                    4
                                                    2
                                                             47.0
                                                                          01:44.8
     514
     995
                 995
                          22071
                                    7
                                                    8
                                                             52.0
                                                                          01:45.4
                                                    4
                                                             38.0
     971
                 971
                          21715
                                                                          01:30.2
     497
                 497
                          22287
                                                    4
                                                             63.0
                                                                          01:12.6
                                    1
     493
                                    7
                                                    7
                                                             40.0
                 493
                          22180
                                                                          01:39.3
     976
                 976
                          21792
                                                   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
                           Massa Finished 2013 Australian Grand Prix
     971
                 211.558
     497
                           Massa Finished 2014
                                                      Austrian Grand Prix Williams
                 214.553
                           Massa Finished 2014
                                                       Bahrain Grand Prix Williams
     493
                  196.26
     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']).
      \rightarrowhead(6)
                                       positionOrder
                                                       fastestLap fastestLapTime
[62]:
          Unnamed: 0
                      resultId
                                 grid
     169
                 169
                          22075
                                   12
                                                   12
                                                             43.0
                                                                          01:46.3
                                                             47.0
     192
                 192
                          22522
                                    6
                                                    5
                                                                          01:46.7
                          21720
     148
                 148
                                   10
                                                    9
                                                             41.0
                                                                          01:30.2
                                                    3
                                                             39.0
     258
                 258
                          22132
                                   10
                                                                          01:32.9
     176
                 176
                          22294
                                   11
                                                   11
                                                             60.0
                                                                          01:12.9
     153
                 153
                                                   10
                                                             49.0
                                                                          01:37.7
                          21787
                                   10
         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
                 211.654 Button Finished 2013 Australian Grand Prix McLaren
     148
                                                   Australian Grand Prix McLaren
                  205.46 Button Finished 2014
     258
```

```
176
                 213.752
                          Button Finished 2014
                                                      Austrian Grand Prix McLaren
     153
                                                       Bahrain Grand Prix McLaren
                  199.33
                          Button Finished
                                             2013
[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
                                                        fastestLapTime \
     1519
                 1519
                           22521
                                    20
                                                     4
                                                              50.0
                                                                           01:44.5
     1500
                           22291
                                                     8
                                                              55.0
                 1500
                                     5
                                                                           01:13.1
     1494
                           22177
                                    13
                                                     4
                                                              38.0
                                                                           01:39.3
                 1494
                                     5
                                                              44.0
     1640
                 1640
                           22373
                                                     1
                                                                           01:53.0
     1774
                 1774
                           21941
                                    19
                                                   10
                                                              38.0
                                                                           01:51.0
     1502
                 1502
                           22308
                                     8
                                                     3
                                                              34.0
                                                                           01:38.5
          fastestLapSpeed
                                         status
                                                 year
                                                                      name x \
                              surname
                  191.341
                                                 2014
                                                       Abu Dhabi Grand Prix
     1519
                           Ricciardo
                                       Finished
     1500
                  213.161
                                                 2014
                                                         Austrian Grand Prix
                           Ricciardo
                                       Finished
     1494
                  196.266
                                       Finished
                                                 2014
                                                          Bahrain Grand Prix
                           Ricciardo
     1640
                  223.187
                           Ricciardo
                                      Finished
                                                 2014
                                                          Belgian Grand Prix
     1774
                  227,224
                           Ricciardo
                                       Finished
                                                 2013
                                                          Belgian Grand Prix
                  215.395
                                                          British Grand Prix
     1502
                           Ricciardo
                                      Finished
                                                 2014
               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']).
      \rightarrowhead(6)
[71]:
                      resultId
                                       positionOrder
                                                       fastestLap fastestLapTime
          Unnamed: 0
                                 grid
                                                             54.0
     515
                 515
                          22520
                                    3
                                                   3
                                                                         01:45.7
     611
                 611
                          22134
                                   15
                                                   5
                                                             56.0
                                                                         01:32.6
                                                   3
                                                             63.0
     498
                 498
                          22286
                                    2
                                                                         01:12.6
                         21791
     476
                 476
                                   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
                                                       Bahrain Grand Prix Williams
                 198.419
                          Bottas Finished
                                             2013
                          Bottas Finished
                                                      Bahrain Grand Prix Williams
     494
                 195.296
                                            2014
```

```
481
                 223.754 Bottas Finished 2013
                                                   Belgian Grand Prix Williams
 [73]: FinalData[((FinalData['year'] == 2013) | (FinalData['year'] == 2014)) &
      \rightarrowhead(6)
 [73]:
                                     positionOrder
                                                   fastestLap fastestLapTime \
           Unnamed: 0
                      resultId grid
     2155
                 2155
                          22070
                                                 7
                                                          47.0
                                                                      01:45.5
     2189
                         22518
                                   2
                                                 1
                                                          49.0
                                                                      01:45.6
                 2189
     2130
                                                 5
                                                          45.0
                 2130
                         21716
                                   3
                                                                      01:29.8
     2171
                         22285
                                   9
                                                 2
                                                          41.0
                 2171
                                                                      01:12.2
                                   9
                                                 5
     2134
                 2134
                         21782
                                                          48.0
                                                                      01:38.2
     2163
                 2163
                         22174
                                   2
                                                          49.0
                                                                      01:37.1
          fastestLapSpeed
                           surname
                                      status year
                                                                  name_x \
     2155
                  189.586 Hamilton Finished 2013
                                                    Abu Dhabi Grand Prix
                          Hamilton Finished 2014
     2189
                                                    Abu Dhabi Grand Prix
                  189.342
     2130
                          Hamilton Finished 2013 Australian Grand Prix
                  212.689
     2171
                          Hamilton Finished 2014
                                                     Austrian Grand Prix
                   215.65
     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
     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.

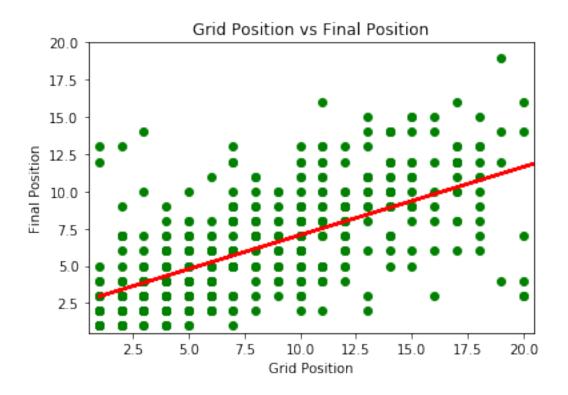
```
[182]: # Trying to check the correlation between Final Position and Grid Position.
      from sklearn.model_selection import train_test_split
      from sklearn.linear_model import LinearRegression
      from sklearn import metrics
      # Using grid as X and position as y
      X = FinalData['grid'].values.reshape(-1,1)
      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)
```

| 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 | [186]: | | Actual | Pre | edicted |
|--|--------|---------|--------|-----|----------|
| 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 | (| О | 2 | 2 | .953810 |
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| 14 2 4.326747 | : | 14 | 2 | 4 | .326747 |
| 15 8 7.072621 | : | 15 | 8 | 7 | .072621 |
| 16 2 2.953810 | : | 16 | 2 | 2 | .953810 |
| 17 3 3.869101 | : | 17 | 3 | 3 | .869101 |
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| 23 10 7.987912 | 2 | 23 | 10 | 7 | .987912 |
| 24 8 7.530266 | 2 | 24 | 8 | 7 | .530266 |
| 25 8 7.072621 | 2 | 25 | 8 | 7 | .072621 |
| 26 4 6.614975 | 2 | 26 | 4 | 6 | .614975 |
| 27 5 7.530266 | 2 | 27 | 5 | 7 | .530266 |
| 28 5 9.360849 | 2 | 28 | 5 | 9 | .360849 |
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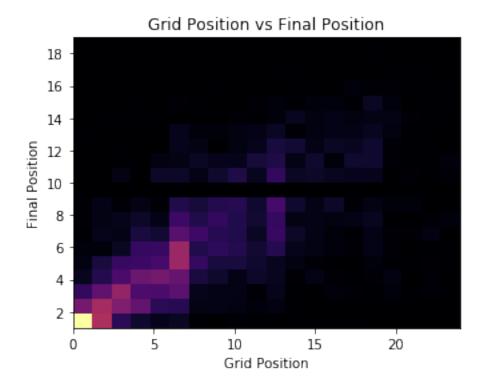
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          8
              6.157329
```

[521 rows x 2 columns]

[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()
```



[]: