

# Predicting Formula 1 Race Performance from Free Practice Data Using Machine Learning

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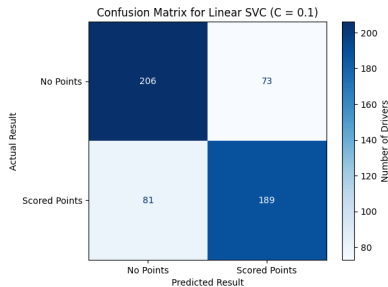
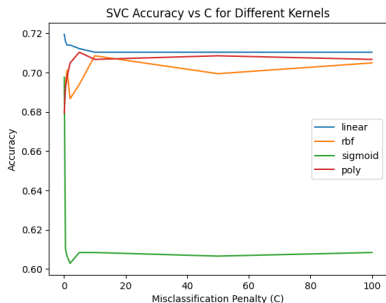
# Data Collection, Cleaning and Feature Engineering

- FastF1 Python package via the **jolpica-f1** API
- A custom **DataAquisition** class

## Key features:

- **Driver performance:**  
FastestFPLap, MeanFPLaps, StdFPLaps, DeltaBestFPLap
- **Weather:**  
TrackTempAvgFP, AirTempAvgFP, RainAvgFP
- **Race outcomes:**  
FastestLapRace, FasterThanTeammateRace, PointFinishRace

# Predicting Point-Scoring Drivers Using an SVC

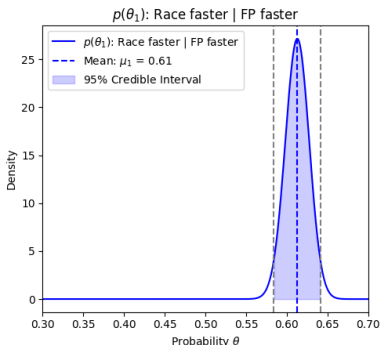
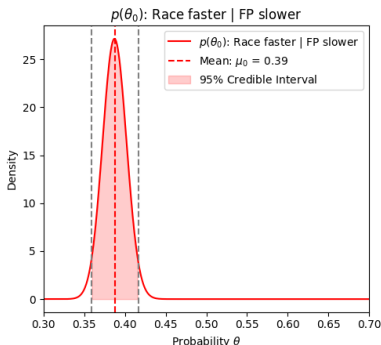


| Class         | Precision | Recall | F1-score |
|---------------|-----------|--------|----------|
| No Points     | 0.72      | 0.74   | 0.73     |
| Scored Points | 0.72      | 0.70   | 0.71     |

# Modeling Teammate Performance Using a Beta-Binomial Model

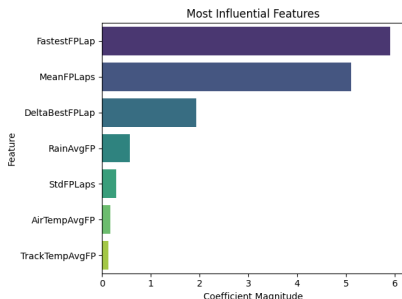
**Prior:**  $\theta \sim \text{Beta}(1, 1) \Rightarrow$  **Posterior:**  $\theta \mid \text{Slower in FP} \sim \text{Beta}(426, 674)$   
**Posterior:**  $\theta \mid \text{Faster in FP} \sim \text{Beta}(674, 426)$

**Posterior distributions of teammate finishing ahead given result of free practice**



# Predicting the Fastest Race Lap Using Linear Regression

| Deg | Model            | $\alpha$ | MAE               | $R^2$              |
|-----|------------------|----------|-------------------|--------------------|
| 1   | LinearReg.       | —        | 1.435 $\pm$ 0.292 | 0.882 $\pm$ 0.065  |
|     | Lasso            | 0.027    | 1.431 $\pm$ 0.278 | 0.885 $\pm$ 0.063  |
|     | Ridge            | 7.055    | 1.428 $\pm$ 0.290 | 0.883 $\pm$ 0.064  |
|     | ElasticNet       | 0.005    | 1.429 $\pm$ 0.291 | 0.883 $\pm$ 0.064  |
|     | EN ( $l_1=0.7$ ) | 0.007    | 1.429 $\pm$ 0.290 | 0.884 $\pm$ 0.064  |
| 2   | LinearReg.       | —        | 2.094 $\pm$ 0.939 | 0.686 $\pm$ 0.296  |
|     | Lasso            | 0.248    | 1.734 $\pm$ 0.669 | 0.734 $\pm$ 0.227  |
|     | Ridge            | 95.455   | 1.874 $\pm$ 0.916 | 0.744 $\pm$ 0.285  |
|     | ElasticNet       | 0.067    | 1.839 $\pm$ 0.887 | 0.744 $\pm$ 0.286  |
|     | EN ( $l_1=0.7$ ) | 0.142    | 1.814 $\pm$ 0.739 | 0.738 $\pm$ 0.238  |
| 3   | LinearReg.       | —        | 3.339 $\pm$ 2.226 | -0.621 $\pm$ 2.117 |
|     | Lasso            | 0.171    | 2.827 $\pm$ 2.307 | -2.005 $\pm$ 3.617 |
|     | Ridge            | 12.328   | 3.282 $\pm$ 2.828 | -1.113 $\pm$ 3.632 |
|     | ElasticNet       | 0.007    | 3.170 $\pm$ 2.860 | -1.056 $\pm$ 3.664 |
|     | EN ( $l_1=0.7$ ) | 0.007    | 3.161 $\pm$ 2.896 | -1.065 $\pm$ 3.705 |



**Final choice:** ElasticNet model with an  $L_1$ -ratio of 0.7

# Testing on new unseen 2025 data

