Jaydeep Sehra, Priya Patel, Brandon Wanatick, Heath Althoff, Jack Oglesby

This study sought to understand the relationship between team payroll and performance, focusing on Major League Baseball (MLB) due to the sport not having a salary capacity

- This is crucial consideration for any financial manager or owner of the team when deciding contract management and budgeting and seeks to answer the question: How effective is the pay to play strategy?
- There is a preconceived notion that more money translates to more wins
- This study analyzes the batting and pitching statistics to predict the payroll for the team, showing if they are under or overpaying for the onfield performance they are receiving


## LITERATURE REVIEW

- During the regular season, there was a positive and statistically significant relationship between the two variables. Higher payroll spending is associated with an increase in regular season winning percentage (Shorin, 2017)
- Unequal distribution of salaries resulted from "star" players receiving significant portion of the payroll may discourage other players to put in effort - ultimately undermining the overall team performance (Lu et al., 2018)
- A rise in team payrolls increases the team's winning percentage, but only to a certain extent before decreasing winning percentage. The study also looked at the effect of winning percentage from increasing Pitcher and Hitter Salaries; increase in pitcher salary was more beneficial than increasing hitter salary (Lu et al., 2018)

Table 1.
Descriptive Statistics for Analyzed Variables

|  |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: |
| TeamPayroll | Minimum | Maximum | Mean | Std. Deviation |
| BatAge | $22,062,600$ | $334,233,332$ | $127,856,800.6$ | $51,301,477.68$ |
| HR | 25.4 | 32.8 | 28.262 | 1.0560 |
| R | 95 | 307 | 182.86 | 39.863 |
| OPS+ | 513 | 947 | 717.82 | 78.909 |
| PAge | 73 | 124 | 97.46 | 8.622 |
| ERA+ | 26.0 | 31.9 | 28.541 | 1.0959 |
| SO9 | 75 | 145 | 102.01 | 11.660 |
| WP | 6.1 | 10.4 | 8.306 | .8104 |
| Playoffs | 26 | 98 | 58.42 | 13.099 |
|  | 0 | 1 | .34 | .476 |

## METHOD

- Analysis of batting, pitching, and playoff stats for all 30 MLB teams for 10 seasons (2013-2023, excluding shortened 2020 season)
- Data gathered from Baseball Reference
- Hierarchical linear regression model made utilizing the three groups:
- Batting stats (Batter age, HR, R, OPS+)
- Pitching stats (Pitcher age, SO9, WP, ERA+)
- Playoffs appearance (whether the team made the playoffs)
- Utilizing team payroll as dependent variable in model
- Second and final model run utilizing only significant variables



RESULTS
Table 2
Final Predictive Model

| Final Predictive Model |  |  |  |
| :--- | ---: | ---: | ---: |
| Variable | Coefficient | Coefficient $t$-statistics | Significance |
| (Constant) | -838962484 | -10.434 | $<.001$ |
| BatAge | 16662297.47 | 7.504 | $<.001$ |
| HR | 239871.382 | 3.651 | $<.001$ |
| PAge | 12889759.61 | 5.777 | $<.001$ |
| SO9 | 12759509.00 | 4.020 | $<.001$ |
| WP | -373693.141 | -2.119 | .035 |
|  |  | $F$-statistic | 47.118 |
|  |  | Significance | $<.001$ |
|  |  | $R^{2}$ | .445 |
|  |  | Adjusted $R^{2}$ | .435 |

- Our model predicts that $44.5 \%$ of the variance in team payroll is explained by average batter age, number of homeruns, average pitcher age, strikeouts over nine innings, and number of wild pitches
- Payroll increases by $\$ 239,871$ with every homerun and decreases by $\$ 373,6934$ with every wild pitch
- Performance Factors: High home run totals (HR), high number of strikeouts (SO9), and less wild pitches (WP) further contribute to increased team payrolls
- Team Strategies: "Undervalued" teams could benefit from targeted veteran acquisitions to boost experience and potential performance. "Overvalued" teams may need to re-evaluate player contracts and consider different talent acquisition approaches

Table 3
Predicted vs. Actual Payroll (Overpaid)

| Preaicted vs. Actual Payroll (Overpaid) |  |  |  |
| :--- | ---: | ---: | ---: |
| Team | Average Payroll | Predicted Payroll | Amount Overpaid |
| Los Angeles Dodgers | $\$ 230,382,167$ | $\$ 166,648,835$ | $\$ 63,733,332$ |
| Boston Red Sox | $\$ 189,187,837$ | $\$ 146,512,778$ | $\$ 42,675,060$ |
| New York Yankees | $\$ 214,401,903$ | $\$ 177,671,150$ | $\$ 36,730,753$ |
| Philadelphia Phillies | $\$ 159,142,467$ | $\$ 126,199,629$ | $\$ 32,942,838$ |
| Los Angeles Angels | $\$ 162,617,123$ | $\$ 130,149,214$ | $\$ 32,467,909$ |
| Seattle Mariners | $\$ 163,854,140$ | $\$ 133,103,100$ | $\$ 30,751,040$ |
| Detroit Tigers | $\$ 140,466,232$ | $\$ 120,099,631$ | $\$ 20,366,601$ |
| Texas Rangers | $\$ 138,805,055$ | $\$ 122,934,109$ | $\$ 15,870,947$ |
| St. Louis Cardinals | $\$ 137,726,707$ | $\$ 124,367,360$ | $\$ 13,359,347$ |
| Chicago Cubs | $\$ 145,532,627$ | $\$ 135,069,392$ | $\$ 10,463,235$ |
| Colorado Rockies | $\$ 118,744,915$ | $\$ 110,417,621$ | $\$ 8,327,295$ |
| Chicago White Sox | $\$ 117,339,592$ | $\$ 109,587,190$ | $\$ 7,752,402$ |
| San Diego Padres | $\$ 125,519,185$ | $\$ 118,104,104$ | $\$ 7,415,081$ |
| New York Mets | $\$ 158,820,431$ | $\$ 152,190,926$ | $\$ 6,629,505$ |
| Atlanta Braves | $\$ 124,075,738$ | $\$ 117,627,355$ | $\$ 6,448,383$ |
| Washington Nationals | $\$ 144,751,802$ | $\$ 144,272,429$ | $\$ 479,373$ |

- World Series Won:
- Underpaying Teams: 4
- Playoff Series Wins Averages:
- Underpaying Teams: 3.3
- Overpaying Teams: 3.6
- MLB Implications: The strong link between team age and payroll warrants further analysis by the league. Understanding this dynamic can help MLB promote competitive balance and financial fairness across teams
- Since the postseason was recently expanded, the Playoffs predictor may become more significant in the future

Table 4
Predicted vs. Actual Payroll (Underpaid)

| Team |  | Average Payroll | Predicted Payroll |
| :--- | ---: | ---: | ---: |
| Amount Underpaid |  |  |  |
| Oakland Athletics | $\$ 70,333,136$ | $\$ 121,532,548$ | $\$ 51,199,412$ |
| Tampa Bay Rays | $\$ 69,369,729$ | $\$ 119,291,385$ | $\$ 49,921,656$ |
| Milwaukee Brewers | $\$ 98,705,659$ | $\$ 136,194,939$ | $\$ 37,489,280$ |
| San Francisco Giants | $\$ 116,191,848$ | $\$ 150,889,953$ | $\$ 34,698,104$ |
| Cleveland Guardians | $\$ 87,834,018$ | $\$ 116,547,092$ | $\$ 28,713,074$ |
| Miami Marlins | $\$ 71,968,095$ | $\$ 99,902,097$ | $\$ 27,934,002$ |
| Pittsburgh Pirates | $\$ 73,142,425$ | $\$ 96,198,631$ | $\$ 23,056,205$ |
| Houston Astros | $\$ 116,707,587$ | $\$ 135,617,665$ | $\$ 18,910,078$ |
| Baltimore Orioles | $\$ 94,496,352$ | $\$ 107,897,127$ | $\$ 13,400,775$ |
| Arizona Diamondbacks | $\$ 99,159,100$ | $\$ 112,207,605$ | $\$ 13,048,505$ |
| Cincinnati Reds | $\$ 107,989,168$ | $\$ 120,288,550$ | $\$ 12,299,382$ |
| Minnesota Twins | $\$ 111,264,998$ | $\$ 120,985,717$ | $\$ 9,720,719$ |
| Toronto Blue Jays | $\$ 146,241,462$ | $\$ 154,958,400$ | $\$ 8,716,938$ |
| Kansas City Royals | $\$ 100,932,520$ | $\$ 108,236,961$ | $\$ 7,304,442$ |

