

Linear Regression Final Project US College Tuition Prediction

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Introduction

Question:

What makes college so expensive?

Can we predict tuition?

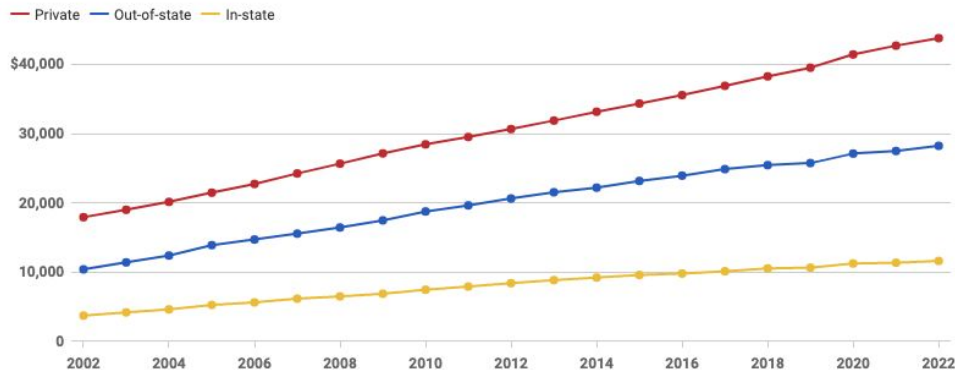
Data Used:

- ★ America's Top Colleges by Forbes
- ★ Cost of College List by the Stephen Phillips Memorial Scholarship Fund Inc.
- ★ US College data
- ★ Global 2000 List By the Center for World University Rankings

Tools:

- ★ Selenium, BeautifulSoup
- ★ Pandas, Matplotlib, Plotly Express
- ★ SKLearn, Statsmodels
- ★ Fuzzywuzzy

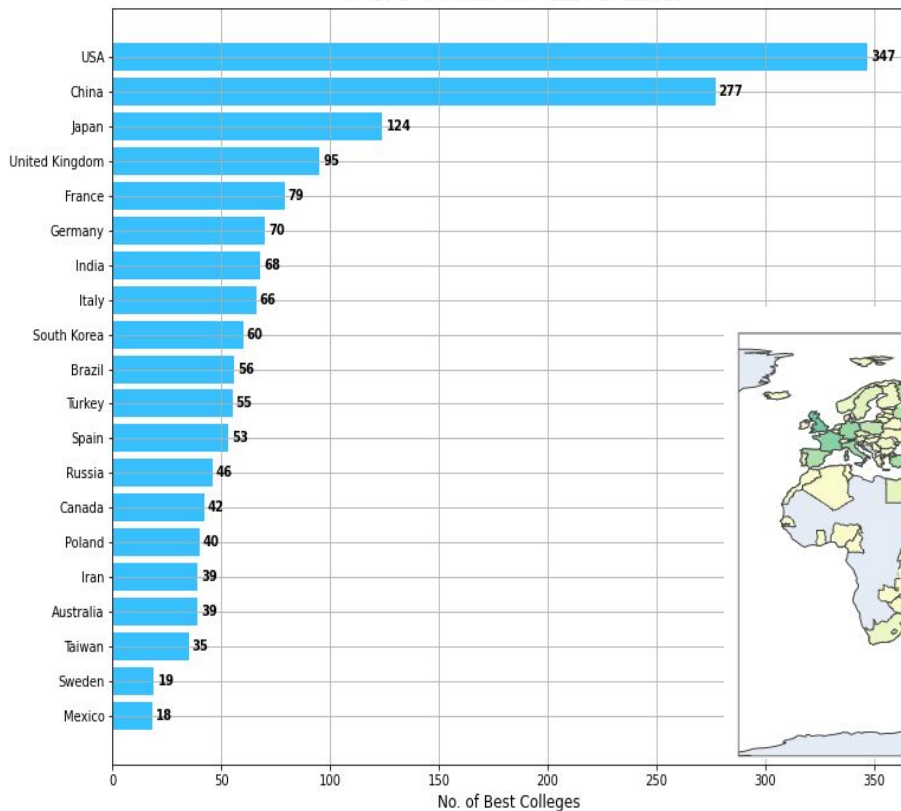
20-Year Average Tuition Growth Among National Universities, 2002-2022



Source: U.S. News & World Report • [Get the data](#)

Top 20 Countries with Best Colleges

TOP 20 COUNTRIES WITH BEST COLLEGES



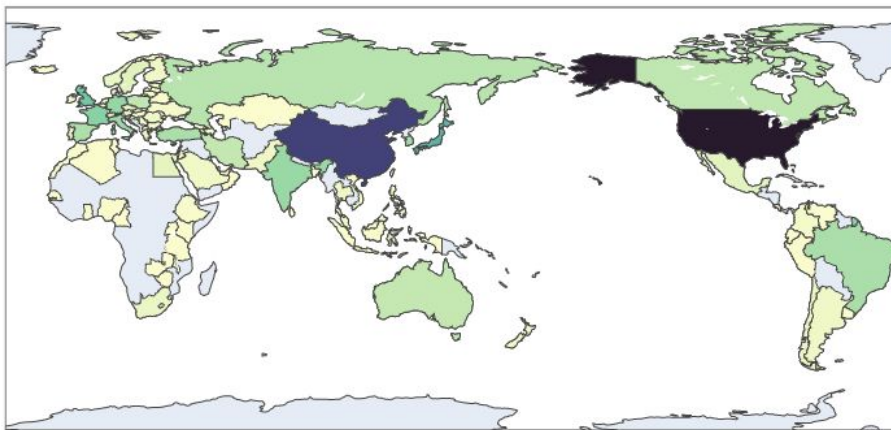
GDP by Country

#	Country	GDP (abbrev.)
1	United States	\$19.485 trillion
2	China	\$12.238 trillion
3	Japan	\$4.872 trillion
4	Germany	\$3.693 trillion

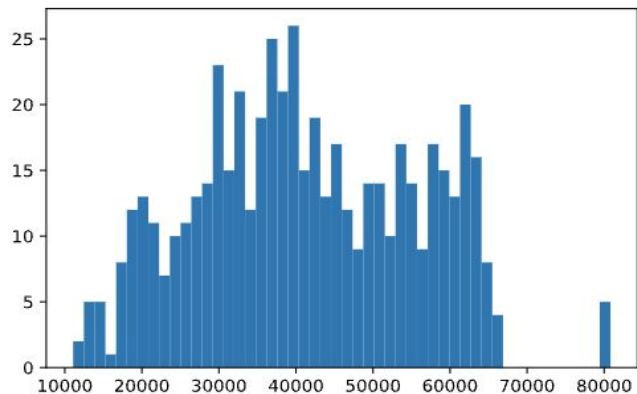
56 more rows

<https://www.worldometers.info/gdp/gdp-by-country/>

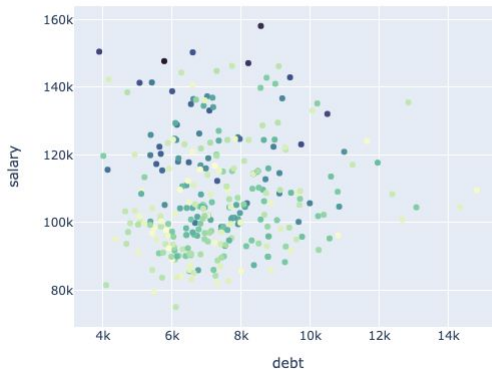
GDP by Country - Worldometer



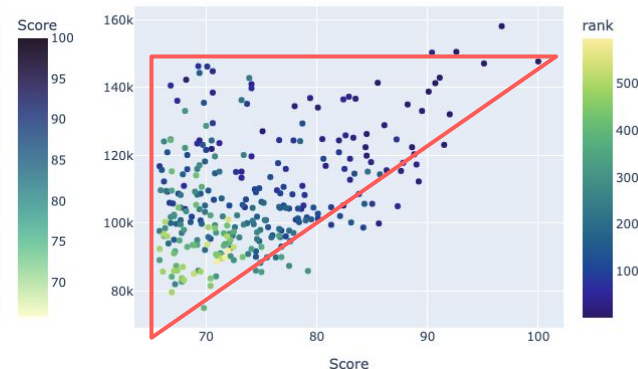
Tuition and Salary



Salary vs Debt



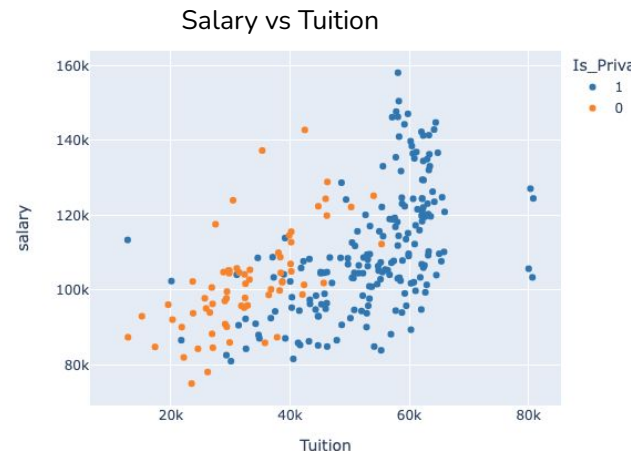
Salary vs Score



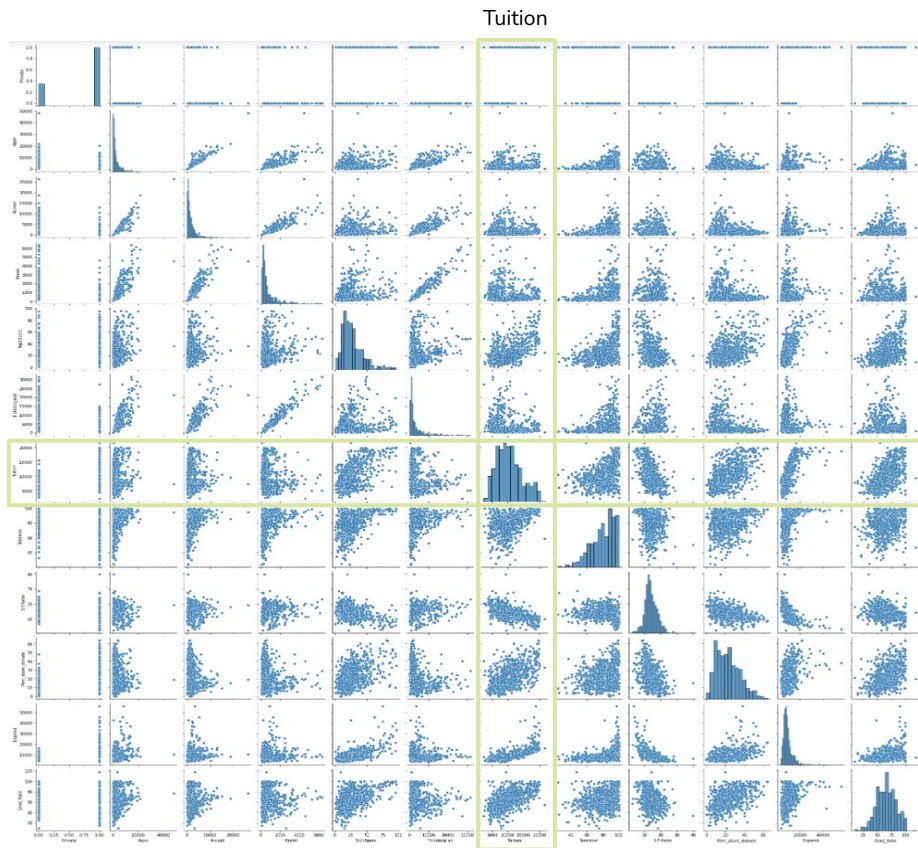
Name	Tuition	Is_Private	rank	state	salary
Bates College	80825.0	1	226.0	ME	124500.0
Connecticut College	80678.0	1	154.0	CT	103400.0
Amherst College	80350.0	1	16.0	MA	127100.0
Colby College	80044.0	1	92.0	ME	105700.0
Union College	79931.0	1	NaN	NaN	NaN
...
Eastern Connecticut State University	12796.0	0	404.0	CT	87400.0
Brigham Young University	12730.0	1	53.0	UT	113400.0
Massachusetts College of Liberal Arts	12579.0	0	NaN	NaN	NaN
Midwestern State University	12380.0	0	NaN	NaN	NaN
Fitchburg State University	11081.0	0	NaN	NaN	NaN

Bates College in ME had the highest tuition.
\$80825 per year!

Good school \neq High Tuition



Features



FEATURES

Private : Public/private indicator

Apps : Number of applications received

Accept : Number of applicants accepted

Enroll : Number of new students enrolled

Top10perc : New students from top 10% of high school class

Top25perc : New students from top 25% of high school class

F.Undergrad : Number of full-time undergraduates

P.Undergrad : Number of part-time undergraduates

Outstate : Out-of-state tuition

Room.Board : Room and board costs

Books : Estimated book costs

Personal : Estimated personal spending

PhD : Percent of faculty with Ph.D.'s

Terminal : Percent of faculty with terminal degree

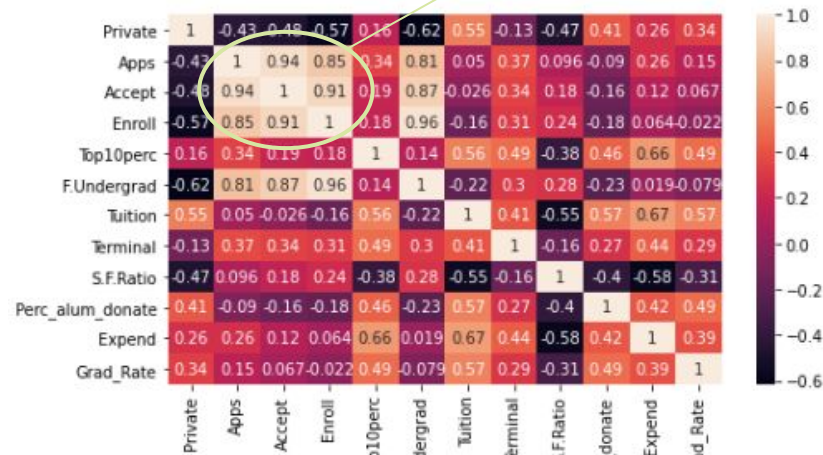
S.F.Ratio : Student/faculty ratio

perc.alumni : Percent of alumni who donate

Expend : Instructional expenditure per student

Grad.Rate : Graduation rate

Showing high correlation, but number of applications, number of applicants accepted, and number of students enrolled do not determine each other.





Linear Regression Model

BASELINE

$R^2 = 0.719$

- ★ High P value features
- ★ Used 80/20 test/train split to validate

MODEL IMPROVEMENT

- ★ Dropped features with high P value ('S.F.Ratio', 'F.Undergrad', 'Top10perc', 'Apps')
- ★ Scaled features to standard normal distribution
- ★ Used train/test split and K-fold cross validation and checked scores for each model

FINAL

$R^2 = 0.730$

MAE 0.444

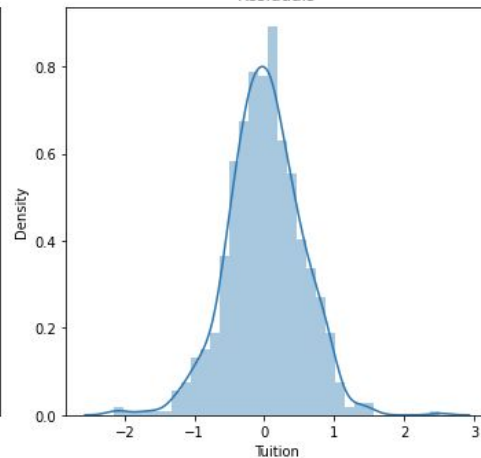
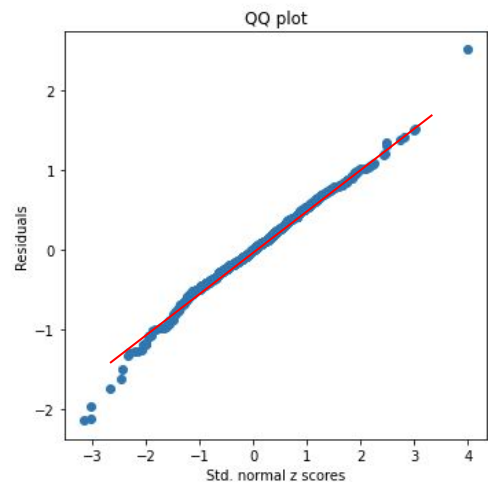
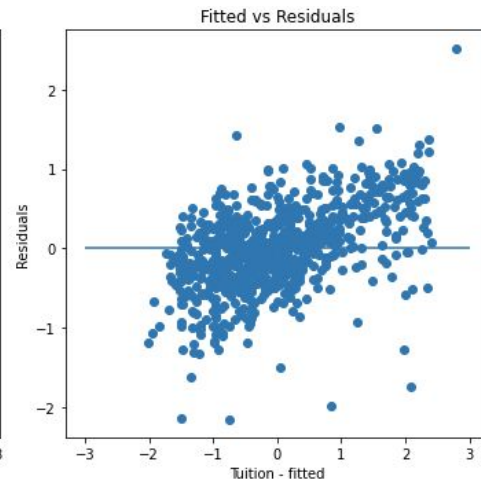
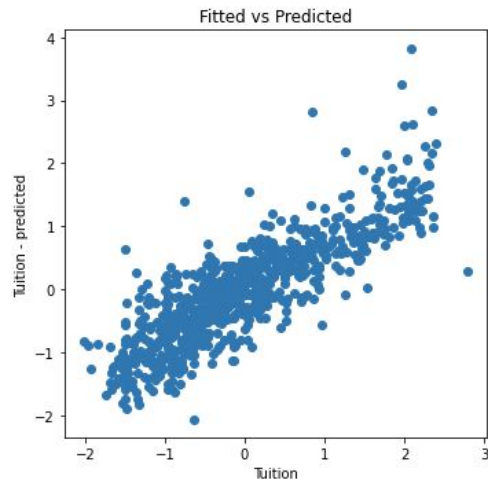
RMSE 0.559

- ★ R^2 train = 0.7303
- ★ R^2 test = 0.7210 (slightly overfit, but not bad)
- ★ Assumptions checked!

Assumptions

- ❑ Linearity
- ❑ Homoscedasticity
- ❑ Independence
- ❑ Normality

Assumptions hold good!





Conclusions

- ★ The baseline model with all features had $R^2 = 0.719$.
- ★ R^2 was improved to 0.730 for the final model with the selected and scaled features.

The Estimated Regression Equation:

$$\text{Tuition} = -0.0062 + 0.3305 * \text{private} - 0.3262 * \text{Apps} + 0.6109 * \text{Accept} - 0.3093 * \text{Enroll} + 0.1086 * \text{Top10perc} + 0.1569 * \text{Terminal} + 0.1557 * \text{Perc_alum_donate} + 0.3454 * \text{Expend} + 0.1338 * \text{Grad_Rate}$$



Appendix

- ❑ America's Top Colleges by Forbes

<https://www.forbes.com/top-colleges/>

- ❑ Cost of College List by the Stephen Phillips Memorial Scholarship Fund Inc.

<https://phillips-scholarship.org/new-applicants/cost-of-college-list/>

- ❑ US College data

<https://www.kaggle.com/datasets/yashgpt/us-college-data>

- ❑ Global 2000 List By the Center for World University Rankings

<https://cwur.org/2021-22.php>