


International Debt Statistics and Projection



Introduction

Our aim is to predict how much debt in terms of percentage of GDP a country can pay back on its external, international loans from the World Bank or IMF. We have incorporated the country's historical debt statistics and various socio-economic factors to assess its ability to repay external loans. The end goal of our model is to identify the root causes of economic instability affecting a country, which, in turn, affects its ability to repay a loan.

The insights from this model will enable organizations like the World Bank to work with countries to mitigate loan defaulting by sending monetary aid, choosing which projects to fund, etc. These insights could be used by government organizations to make better decisions regarding external borrowing and allow them to monitor their ongoing debt. Our model can also be used by NGOs to help them target their interventions by addressing the root cause of the problem.



Data

| Hospital beds (per 1,000 people) | Number of neonatal deaths | Physicians (per 1,000 people) | Population ages 15-19, male (% of male population) | Population ages 35-39, male | Population ages 55-59, male (% of male population) | Population ages 65 and above, male (% of male population) | Rural population growth (annual %) | School enrollment, secondary, female (% gross) | Sex ratio at birth (male births per female births) |
|----------------------------------|---------------------------|-------------------------------|--|-----------------------------|--|---|------------------------------------|--|--|
| 0.170626998 | NA | 0.035 | 10.252415 | 261456 | 2.666401 | 2.949109 | NA | NA | 1.049 |
| NA | NA | NA | 10.291583 | 266698 | 2.633083 | 2.921745 | 1.616510333 | NA | 1.049 |
| NA | NA | NA | 10.310921 | 272509 | 2.592152 | 2.889481 | 1.694596635 | NA | 1.049 |
| NA | NA | NA | 10.263812 | 278443 | 2.548916 | 2.855172 | 1.748878535 | NA | 1.049 |
| NA | NA | NA | 10.162685 | 283951 | 2.512455 | 2.821868 | 1.797359522 | NA | 1.049 |
| — | — | — | — | — | — | — | — | — | — |
| NA | 12874 | 0.201 | 11.836914 | 429834 | 1.591278 | 2.877222 | 2.061844399 | NA | 1.023 |
| NA | 12638 | NA | 11.782546 | 450009 | 1.567252 | 2.902687 | 1.987780433 | NA | 1.023 |
| NA | 12421 | 0.189 | 11.662186 | 462417 | 1.555282 | 2.902155 | 1.983890973 | NA | 1.024 |
| NA | 12211 | NA | 11.512926 | 463351 | 1.549076 | 2.856109 | 1.955651308 | NA | 1.024 |
| NA | NA | NA | 11.378125 | 457281 | 1.554298 | 2.783890 | 1.888043327 | NA | NA |

| Country | Year | Debt Percent of GDP | ANER; Female | Above Proficiency:PISA 2000 for grade 15Y using MPL Level 2 for math | Above Proficiency;TIMSS 2003 for grade 4 using MPL Low (400 points) for math | Above Proficiency;TIMSS 2007 for grade 4 using MPL Low (400 points) for math | Above Proficiency;TIMSS 2019 for grade 4 using MPL Low (400 points) for math | Adjusted net attendance rate, one year before the official primary entry age, adjusted gender parity index (GPIA) | Hospital beds (per 1,000 people) | Num neon de |
|----------|------|---------------------|--------------|--|--|--|--|---|----------------------------------|-------------|
| Belgium | 2015 | 88.82606755 | — | — | — | — | — | — | 5.83 | |
| Belgium | 2016 | 89.15005173 | 3.776007 | — | — | — | — | — | 5.76 | |
| Belgium | 2017 | 86.98393439 | — | — | — | — | — | — | 5.66 | |
| Belgium | 2018 | 84.9649278 | — | — | — | — | — | — | 5.62 | |
| Belgium | 2019 | 82.8536807 | — | — | — | — | — | — | 5.58 | |
| — | — | — | — | — | — | — | — | — | — | — |
| Zimbabwe | 2018 | 51.00144461 | — | — | — | — | — | — | — | 10 |
| Zimbabwe | 2019 | 82.33805679 | — | — | — | — | 0.9735 | — | — | 10 |
| Zimbabwe | 2020 | 84.44771597 | — | — | — | — | — | — | — | 10 |
| Zimbabwe | 2021 | 59.80656696 | — | — | — | — | — | — | — | 10 |
| Zimbabwe | 2022 | 92.8237321 | — | — | — | — | — | — | — | — |

The source for our dataset is mainly the world bank and U.S. Department of the Treasury.

This dataset contains around 172 countries from 1960s to 2022. It has 114 columns and 11K rows in total. The columns comprises a wide array of indicators spanning multiple socio-economic, educational, health, labor, demographic, and miscellaneous domains.

Methods

XGBoost

| | Importance |
|---|------------|
| Number of neonatal deaths | 0.042312 |
| Adolescent fertility rate (births per 1,000 women ages 15-19) | 0.038844 |
| Age dependency ratio, old | 0.034451 |
| Gross enrolment ratio, primary, gender parity index (GPI) | 0.033064 |
| Age dependency ratio (% of working-age population)_y | 0.030751 |
| Rural population growth (annual %) | 0.029595 |
| Sex ratio at birth (male births per female births) | 0.026358 |
| Population ages 15-19, male (% of male population) | 0.023815 |

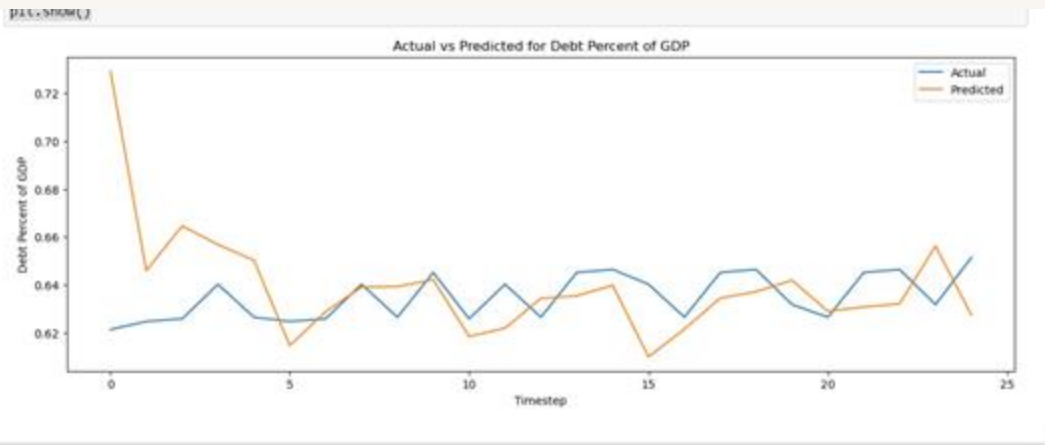
VAR

| | AIC | BIC | FPE | HQIC |
|---|---------|--------|------------|---------|
| 0 | 49.58 | 49.93 | 3.416e+21 | 49.72 |
| 1 | -2.737 | 1.136* | 0.06768 | -1.225 |
| 2 | -4.259 | 3.136 | 0.01958 | -1.372 |
| 3 | -6.514 | 4.401 | 0.004763 | -2.253 |
| 4 | -10.32* | 4.113 | 0.0008466* | -4.688* |

LSTM

- Masking
- Rolling Window
- Custom Error Function

Current results




0.003

Mean Absolute Error



Work remaining

Currently we have some work that we need to do to make our model better than what it is now

1. Reshape Time-Series data
 2. Test a custom cube loss function
 3. Try dealing with the lag by adding a lag column
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Thank You!

