

A stylized world map in a light gray color, centered on the Atlantic Ocean, serving as a background for the text.

Classification of World Economies

Prediction of Upcoming Growth or Decline



Laura Fedoruk - P.Eng., M.Sc.

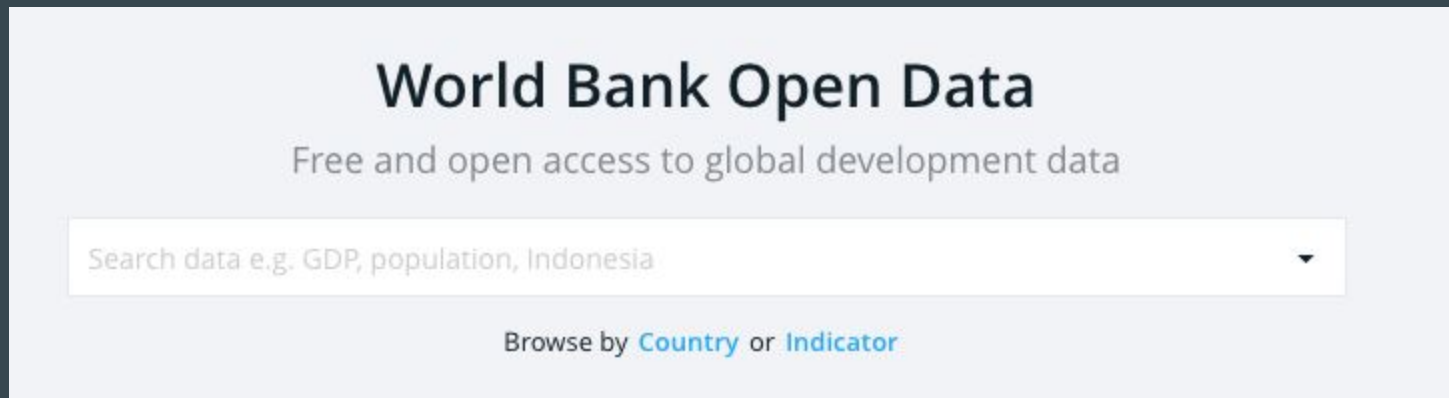
Goal

To use development indicators such as those related to education, health, environment, and economic industry makeup to create a classification model to predict whether an economy would be likely to grow or shrink in any particular upcoming year.

To see if performance of indicators such as those related to the millennium development goals relates to better economic performance and reduced instances of shrinking economies and economic hardships.



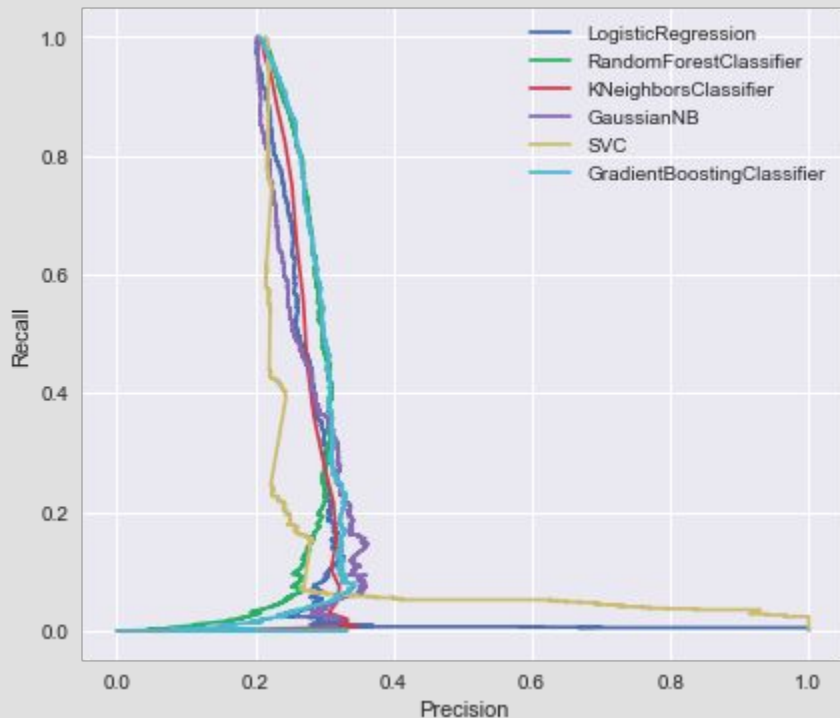
The World Bank Open Data Initiative



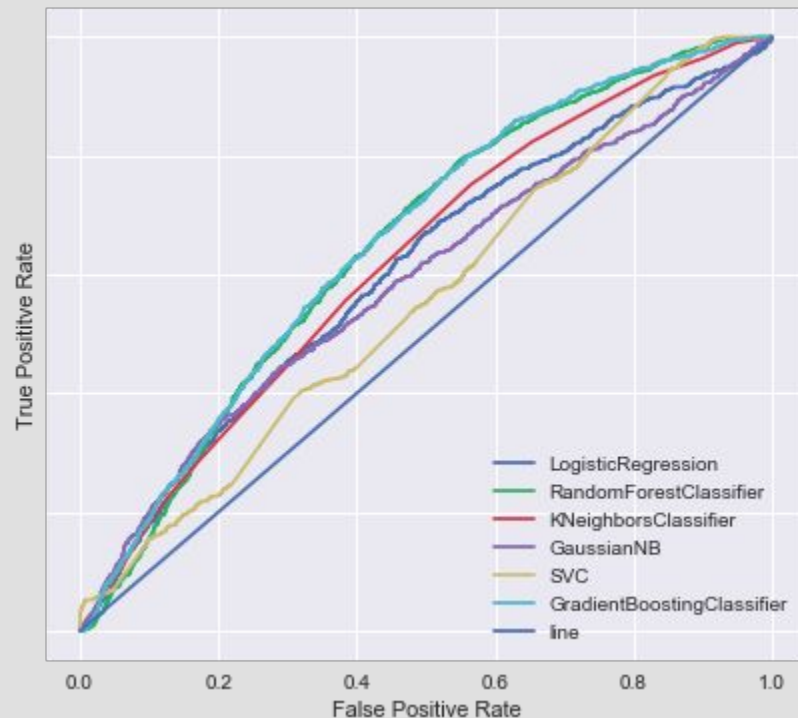
- 263 Country Codes
- 55 years of measurement of 1500+ indicators (14,465 rows)
- 147,000+ individual data points
- Model data reduced to 33 features and 5,566 rows with enough data to be meaningful
- July 2017 release of world development indicators

Model Choice

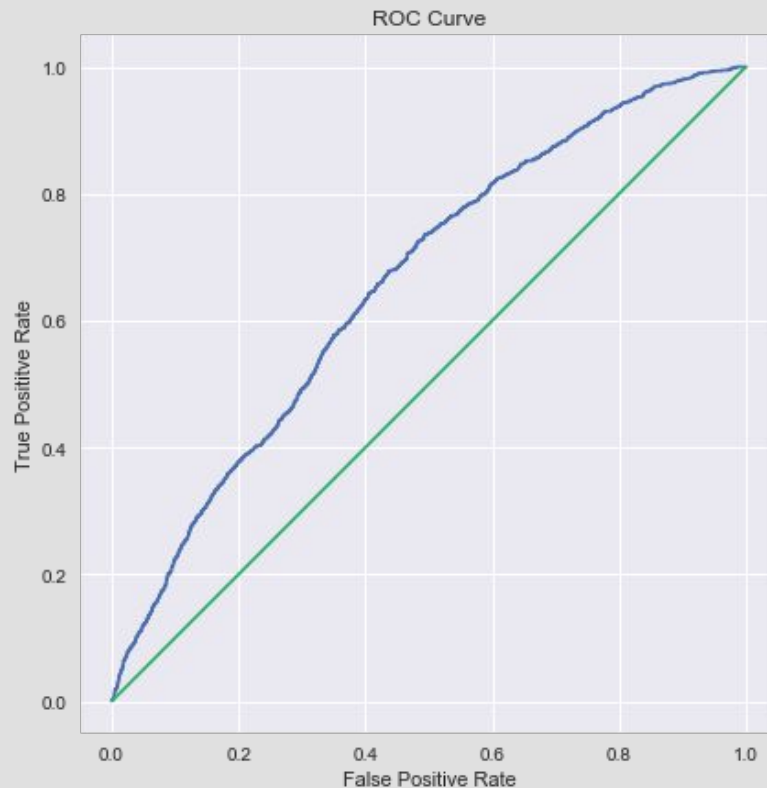
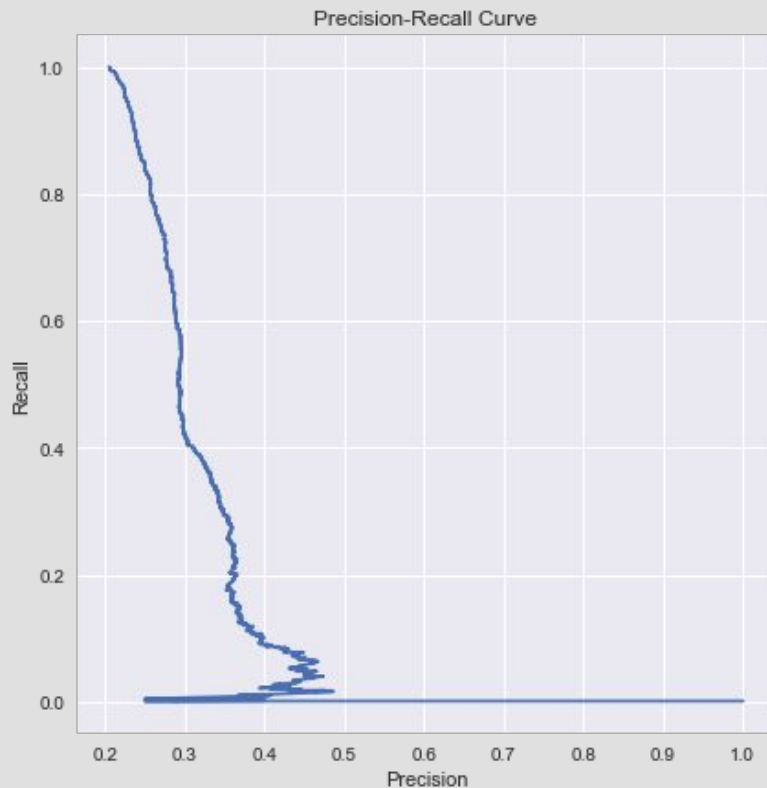
Precision-Recall Curve



ROC Curve

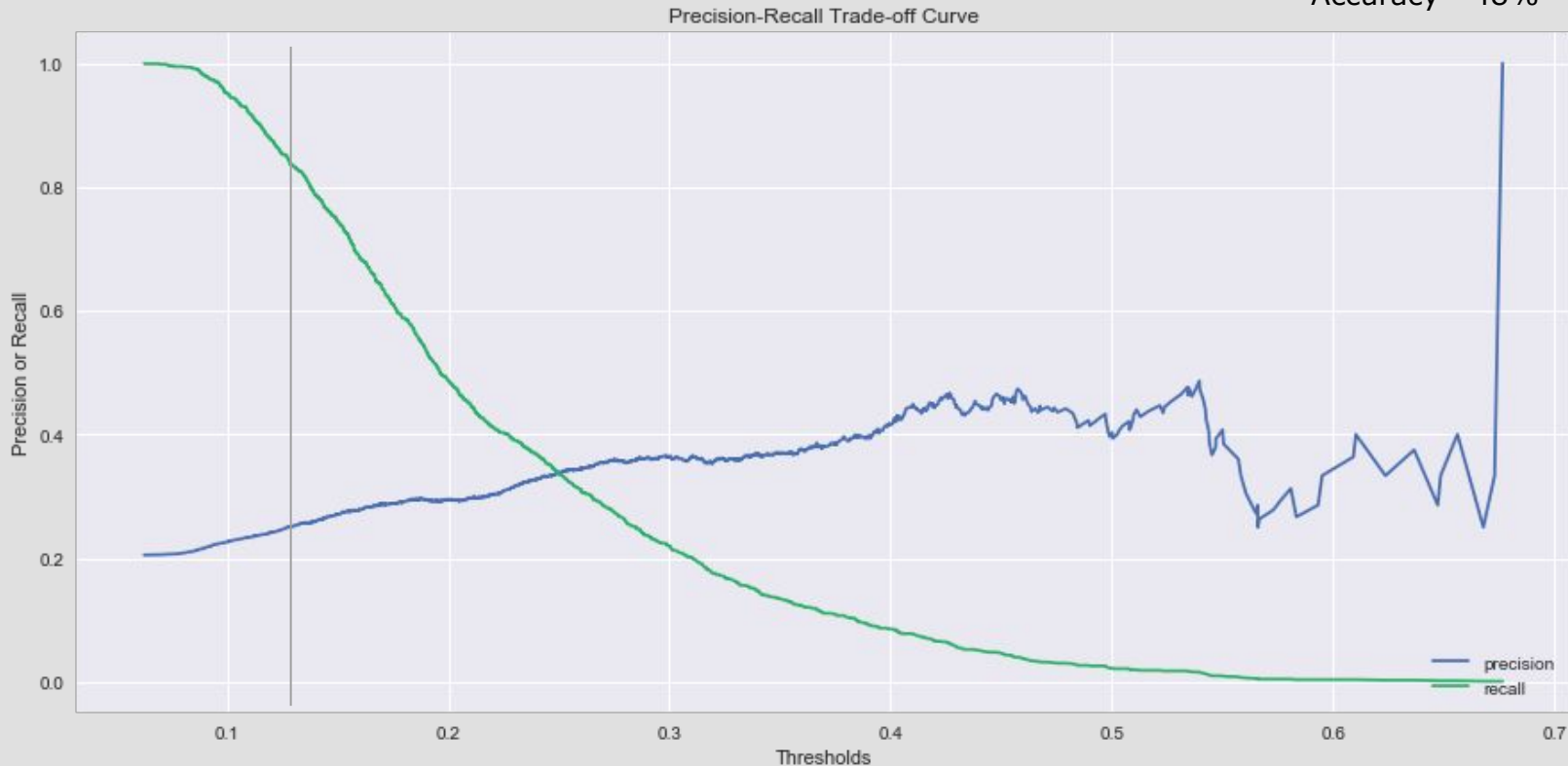


Confusion Curves

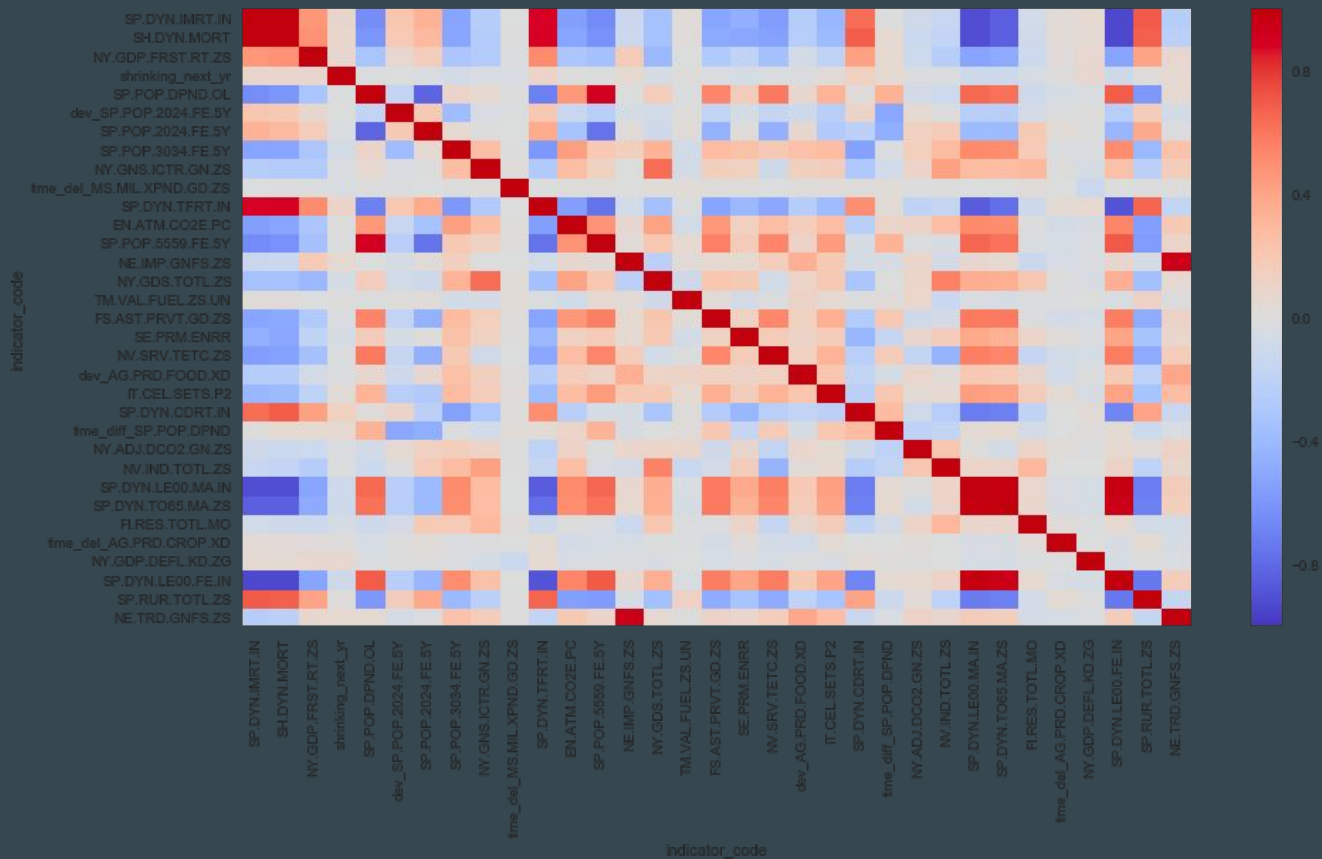


Choice of Threshold

Precision - 25.5%
Recall - 82.6%
F1 Score - 0.389
Log-Loss - 0.48
ROC AUC - 0.66
Accuracy - 48%

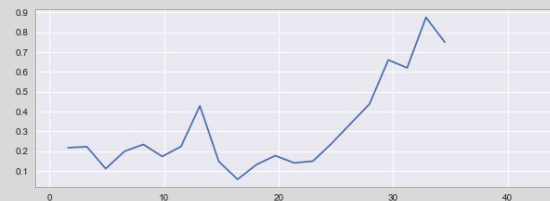


Interesting Features

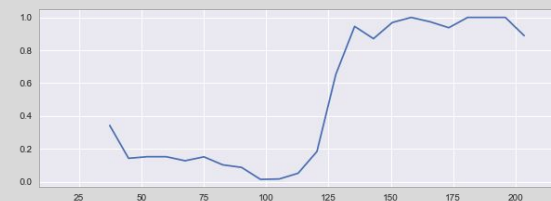
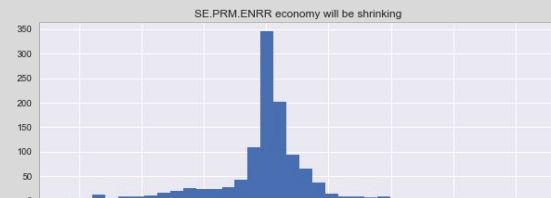
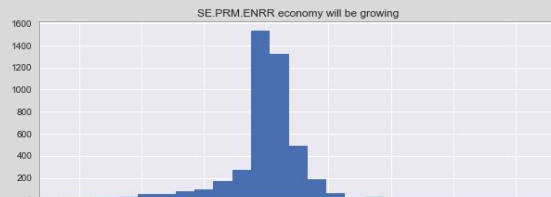


Interesting Features

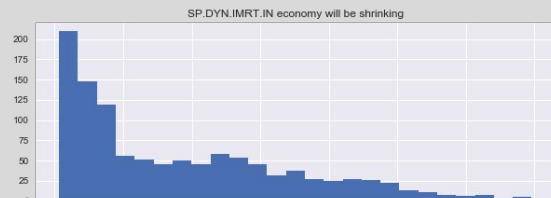
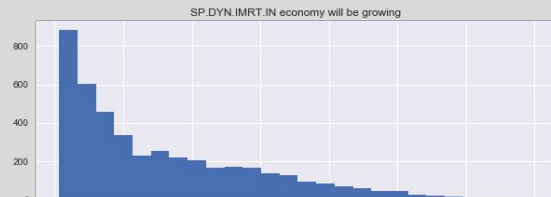
59 Age dependency ratio, old (% of working-age po...
Name: indicator_name, dtype: object



191 School enrolment, primary (% gross)
Name: indicator_name, dtype: object



81 Mortality rate, infant (per 1,000 live births)
Name: indicator_name, dtype: object



Age Dependency Ratio

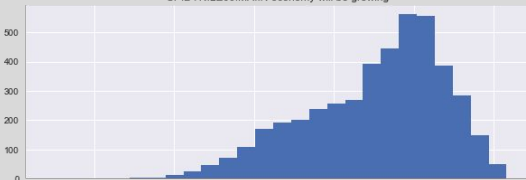
Primary School Enrollment

Infant Mortality Rate

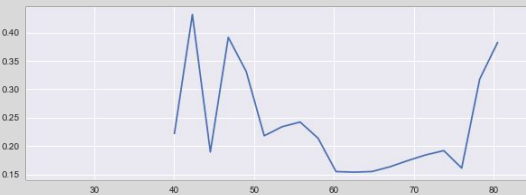
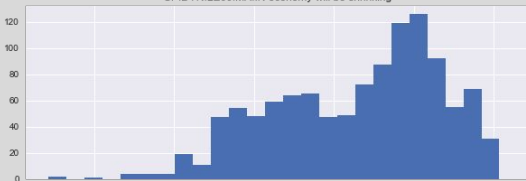
Interesting Features

14 Life expectancy at birth, male (years)
Name: indicator_name, dtype: object

SP.DYN.LE00.MA.IN economy will be growing



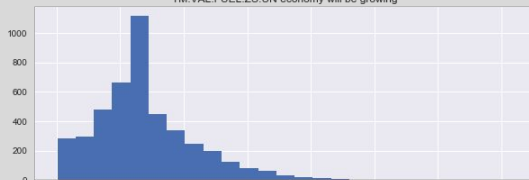
SP.DYN.LE00.MA.IN economy will be shrinking



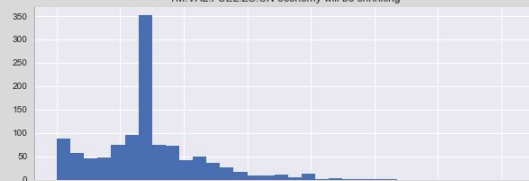
Life Expectancy - Male

235 Fuel imports (% of merchandise imports)
Name: indicator_name, dtype: object

TM.VAL.FUEL.ZS.UN economy will be growing



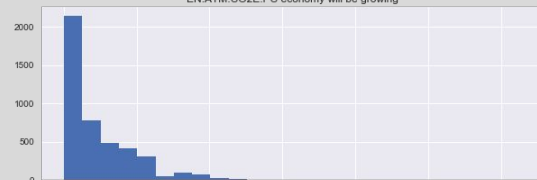
TM.VAL.FUEL.ZS.UN economy will be shrinking



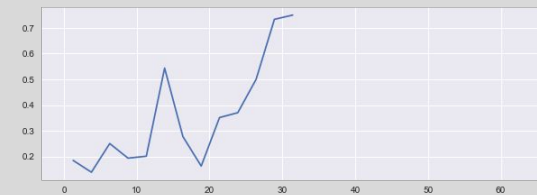
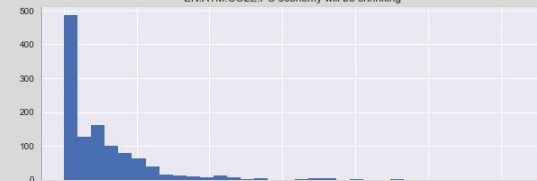
Fuel Imports

80 CO₂ emissions (metric tons per capita)
Name: indicator_name, dtype: object

EN.ATM.CO2E.PC economy will be growing



EN.ATM.CO2E.PC economy will be shrinking



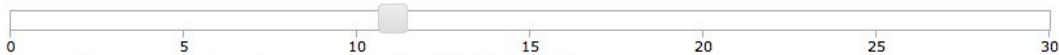
CO₂ emissions/capita

Playing with Predictions

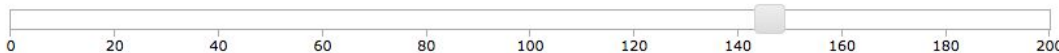
Likelihood of Economy Shrinking in next Measured Year

15.8%

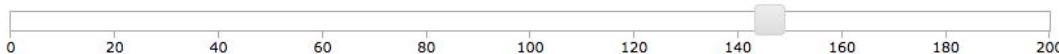
Age dependency ratio (% of working-age population): 11



Mortality rate, infant (per 1,000 live births): 146



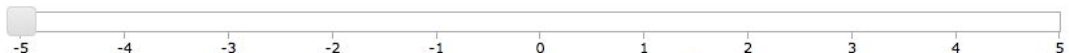
Mortality rate, under-5 (per 1,000 live births): 146



Forest rents (% of GDP): 29



Deviation from mean - Population ages 20-24, female (% of female population): 0



Population ages 20-24, female (% of female population): 4

Suggested Future Work

- Use of proxy data for countries that have missing data
- Analysis of spending on MDGs, debt forgiveness, and indicator response
- Election prediction
- Addition of data for world economic/indicator trends proxies
- Reducing personal bias in initial indicator selection and explanation

Interesting Features

- Annual Inflation Rate
- Carbon Dioxide Damage (% of GNI)
- Industry, value added (% of GDP)
- Total Reserves in Months of Imports
- School enrollment, primary (% gross)
- Mobile cellular subscriptions (per 100 people)
- Fuel imports (% of merchandise imports)
- Domestic credit to private sector (% of GDP)
- Trade (% of GDP)
- Services, etc., value added (% of GDP)
- Imports of goods and services (% of GDP)
- Gross domestic savings (% of GDP)
- Gross savings (% of GNI)
- CO2 emissions (metric tons per capita)
- Deviation from mean - Food production index (2004-2006 = 100)
- Change from previous year in Crop production index (2004-2006 = 100)
- Forest rents (% of GDP)
- Rate of Change of Military expenditure (% of GDP)
- Death rate, crude (per 1,000 people)
- Life expectancy at birth, female (years)
- Life expectancy at birth, male (years)
- Survival to age 65, male (% of cohort)
- Fertility rate, total (births per woman)
- Mortality rate, infant (per 1,000 live births)
- Mortality rate, under-5 (per 1,000 live births)
- Rural population (% of total population)
- Population ages 20-24, female (% of female population)
- Deviation from mean - Population ages 20-24, female (% of female population)
- Population ages 30-34, female (% of female population)
- Population ages 55-59, female (% of female population)
- Age dependency ratio, old (% of working-age population)
- Rate of Change of Age dependency ratio (% of working-age population)