

International Debt Statistics Analysis Using a Multiple Linear Regression Model

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Abstract: This study uses multiple linear regression to analyze the factors that influence a nation's foreign debt. The study looks for important indicators of a nation's external debt using a dataset of economic data, including GDP growth, inflation rate, trade balance, interest rates, and foreign direct investment. Based on data from a representative sample of countries over the past 20 years, the research offers insights into both industrialized and emerging economies. Results show that while GDP growth has a moderating effect, higher inflation and trade deficits are consistently associated with larger external debt. The model highlights the intricacies of international financing and finds a statistically significant relationship between the selected factors and foreign debt. In a globalized financial environment, these observations provide crucial information for policymakers seeking to influence economic policy and control manageable debt levels.

Key Words: This study focuses on international debt, using multiple linear regression to analyze external debt determinants based on economic indicators such as GDP growth, inflation, trade balance, and interest rates, with implications for debt sustainability and global financial policy.

I. INTRODUCTION

Because it affects financial stability, sovereignty, and sustainable development, the issue of debt in developing countries continues to be a major concern in the global economy. Due to historical structural inefficiencies, reliance on foreign funding, and vulnerability to shocks from the global financial system, the majority of developing nations have accrued significant external debt. A focused analysis of countries like China, India, and Ukraine reveals different debt accumulation and management strategies that reflect broader patterns in emerging markets [1]. Understanding the dynamics of debt, driving capital flows, debt sustainability, and economic resilience requires an awareness of the intricate web of financial interdependence between emerging economies and the industrialized world, especially OECD nations [2]. Furthermore, a greater understanding of debt distribution, risk exposure, and policy impact can be gained by studying international debt statistics using data analytics tools like PostgreSQL [3]. Global organizations like the IMF and World Bank have developed systematic databases and monitoring systems, like the Global Debt Database and the Global Debt Monitor, to facilitate improved transparency and policy coordination. These systems and approaches are essential for decision-making [4] [5]. The relationship between Pakistan's external debt and foreign exchange reserves illustrates the risk of macroeconomic imbalances and inadequate fiscal management [6]. Therefore, assessing national vulnerabilities and guiding debt restructuring efforts require robust foreign debt information and their careful interpretation [7][1].

II. LITERATURE

○ "Global Debt Monitor (IMF) 2024"

The article offers a global viewpoint on debt patterns in the wake of the COVID-19 outbreak. It offers a thorough examination of the factors influencing the worldwide public and private debt of developed, developing, and low-income economies. The macroeconomic explanations of recent debt trends, such as unexpected inflation and changing growth expectations, are also examined.

○ Arif Ullah and colleagues' article "The Major Determinants of Foreign Exchange Reserve: The Promise and Perils of Pakistan Economic Crises" (2024)

This study looks at the relationship between Pakistan's foreign exchange reserves and macroeconomic factors such inflation, exports, exchange rates, and external debt. By using advanced time-series econometric analysis, the paper highlights weaknesses in Pakistan's economic structure by shedding light on the interactions between rising debt loads, declining reserves, and inflationary pressures.

○ "IMF's Guide for Compilers and Users on External Debt Statistics" (2014)

The methodological basis for gathering, presenting, and evaluating external debt figures is provided by this comprehensive guidance. It was created by the Inter-Agency Task Force on Finance Statistics and serves as the primary source of information for cross-country analysis and debt sustainability analysis (DSA) by standardizing ideas, accounting regulations, and data forms.

○ **Muhammad Taha Nasir & Shavkatjon Tulkinov's "Navigating the Maze of Global Debt: An Analysis of International Debt Statistics with PostgreSQL" (2023)**

This study uses PostgreSQL data analysis to assess international debt statistics from the World Bank's IDS database. The study examines debt burdens and tracks trends in long-term external debt with a focus on developing countries. It emphasizes how data science may be used to increase debt transparency and help decision-makers comprehend complex economic data.

○ **Mike Seiferling's book "Apples, Oranges, and Lemons: Public Sector Debt Statistics in the 21st Century" (2020)**

The discrepancy in governmental debt reporting and the challenge of comparing foreign debt figures are criticized in this article. It looks at how the public's perception of national debt is distorted by disparities in definitions, transparency, and media misreporting. Additionally, the author includes empirical study of term inconsistencies and media bias in debt reporting.

○ **"The foreign debt of a developing country" by Thomas M. Klein (IMF)**

Thomas M. Klein examines the complex relationships between foreign debt accumulation and economic growth in developing nations in this landmark paper. The topic of external borrowing as a calculated strategy to accelerate capital formation and GDP is given top priority in the study. It does, however, highlight the necessity of rigorous external debt management, particularly with regard to aligning debt servicing commitments with a country's foreign exchange earnings. The literature demonstrates the need of accurate debt statistics and macroeconomic modeling in assessing the long-term viability of external financing. It also emphasizes how institutional arrangements are evolving to assist data quality and transparency in debt in the global south, especially those backed by organizations like the World Bank.

○ **"An Analysis About the International Debt of Developing Countries: A Case Study About China, India and Ukraine" written by Qiyuan Li**

This new empirical study by Qiyuan Li offers a quantitative look at how foreign debt has changed among the three main emerging nations—China, India, and Ukraine—during a turbulent five years that included the COVID-19 epidemic and the debt crisis in the United States. The study examines how macroeconomic shocks, currency devaluation, and governance frameworks influence sovereign lending behavior by tracing the structural and temporal variations in debt patterns using data from the World Bank's international debt statistics. This body of work is crucial in showing how external debt can show both economic resilience and susceptibility, particularly for governments balancing fiscal pressure with growth aspirations.

○ **Paul Saunders and Andrew Dean's paper, "The International Debt Situation and Linkages Between Developing Countries and the OECD" (OECD)**

Saunders and Dean's analysis places the worldwide debt crisis of the 1980s into the broader framework of global financial processes and the interdependencies between OECD developing nations. The authors propose a system for debt accounting that links interest rates, export volumes, trade flows, and policy shifts among debtor groups. By classifying nations into "problem" and "stable" debtor groups, the analysis is better able to understand the variety of debt impacts. In order to understand how external macroeconomic factors can spread or control sovereign debt risks in emerging nations, this contribution provides a model-based framework for extrapolating debt pathways and policy actions.

○ **Kyungla Chae (IMF), Marialuz Moreno Badia, and Samba Mbaye's "Global Debt Database: Methodology and Sources"**

A pillar of contemporary debt research, the Global Debt Database (GDD) methodology article represents a paradigm shift in the curation and comparison of sovereign and private debt data. This study, created by the IMF's Fiscal Affairs Department, presents a multifaceted dataset covering more than 190 nations over several decades. The study tackles a long-standing trade-off in global debt analysis: the balance between conceptual scope and historical depth. It does this by harmonizing long-run time series with comprehensive debt definitions. For cross-national debt analytics, the GDD is the gold standard, allowing for the thorough empirical testing of macroeconomic theories based on debt.

Methodology

This section describes the methodical process used to use multiple linear regression analysis to look at the economic factors that influence foreign debt. Data sourcing, preprocessing, variable selection, model formulation, and evaluation methods are all included in the methodology.

Design of Research

In order to investigate the relationship between a nation's external debt and particular macroeconomic variables, the study uses a quantitative, correlational research design. Because it can estimate the linear relationship between several independent variables (economic indicators) and one dependent variable (foreign debt), multiple linear regression (MLR) is the method of choice.

Sources of Data

Reputable international financial organizations, such as the United Nations Conference on Trade and Development (UNCTAD), the International Monetary Fund (IMF), and the World Bank's World Development Indicators (WDI), provided the

dataset used in this analysis. These sources offered reliable, yearly data at the national level for both established and emerging economies from 2000 to 2023.

Data Description and Variables Dependent Variable:

External Debt (either expressed as a percentage of GDP or in USD)

Differential variables:

GDP Growth Rate (percentage change per year) The Consumer Price Index's annual inflation rate Trade Balance (exports less imports expressed as a percentage of GDP)

Interest rates (base rates set by the central bank or lending rates)

Foreign Direct Investment (FDI) as a percentage of GDP (net inflows)

Every variable was chosen on the basis of its theoretical significance and empirical backing from earlier research.

Preprocessing Data

The preprocessing processes listed below were used to guarantee the analysis's integrity and quality: Managing Missing Values: Linear interpolation was used to impute missing values or to remove countries with incomplete time series data for important variables.

Outlier Detection and Treatment: Boxplots and z-scores were used to identify extreme data, and winsorization was applied as necessary.

Normalization: To guarantee comparability and enhance model convergence, continuous variables were standardized (z-score normalization). **Multicollinearity Check:** To detect and reduce multicollinearity among predictor variables, Variance Inflation Factor (VIF) analysis was performed.

Validation and Assessment of the Model:

The following performance evaluation and diagnostic metrics were used to gauge the model's dependability and predictive ability:

- R-squared and adjusted R-squared values for goodness of fit
- Significance testing: p-values < 0.05 are deemed significant in t-tests for individual coefficients.
- Testing Assumptions:

Homoscedasticity (Breusch-Pagan test) and linearity (residual vs. fitted plot)

o Normality of residuals (Q-Q plot and Shapiro-Wilk test)

o Error independence (Durbin-Watson statistic).

Tools for Software

Python (Pandas, NumPy, Statsmodels, Seaborn) was used for data processing, statistical analysis, and visualization.

R (for results cross-checking and validation) Microsoft Excel (for exploratory analysis and preliminary data cleaning)

III.CONCLUSION

In today's globalized economy, the reviewed literature as a whole highlight the increasing complexity, importance, and concerns related to foreign debt. While global private debt has decreased since the epidemic, public debt is still increasing, especially in emerging markets and low-income developing nations, due to weak growth forecasts and inflation dynamics, according to the IMF's 2024 Global Debt Monitor [5]

Arif Ullah et al.'s case study on Pakistan from 2024 shows how high external debt loads put pressure on macroeconomic stability in emerging nations when combined with inflation and foreign exchange volatility. Their findings emphasize the significance of country-specific analysis by highlighting the Complex and frequently contradictory correlations between debt and foreign reserves [2] On the other hand, the fundamental methodological foundation required for gathering and analyzing external debt statistics is provided by the IMF's 2014 Guide to External Debt Statistics. For efficient debt sustainability analysis and cross-border comparisons, it lays out uniformity and openness as requirements [1] The work of Nasir and Tulkinov [7] shows how useful contemporary tools like PostgreSQL are for processing big datasets, spotting debt trends, and making complex debt indicators easier to understand from a data analytics perspective. Their results confirm that long-term debt loads are disproportionately borne by emerging nations, indicating the necessity for stronger monitoring systems [7] Finally, Mike Seiferling (2020) brings up an important point about how debt figures should be interpreted and shared. He contends that despite advancements in the accessibility of data, misunderstandings persist in public debate and policy circles due to media misrepresentation, terminology discrepancies, and transparency gaps [3].

References

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2. The International Debt Situation and Linkages Between Developing Countries and the OECD
3. Navigating the Maze of Global Debt: An Analysis of International Debt Statistics with PostgreSQL
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