

Modeling the Impact of Commodity Prices and Interest Rates on the CAD/USD Exchange Rate: An Analysis of Key Drivers Using Bank Rate and BCPI*

Increase in bank rate, overall prices and metal prices weaken the Canadian dollar, while rising energy prices strengthen it.

Xinqi Yue

December 3, 2024

This study examines the factors influencing the USD/CAD exchange rate, focusing on the impact of Canadian bank rates and commodity prices. The analysis shows that higher bank rates and rising commodity prices, especially metal and total BCPI, are linked to a weaker Canadian dollar. In contrast, higher energy prices are associated with a stronger Canadian dollar. These findings are important for policymakers and investors as they help understand the key drivers of currency fluctuations and their broader economic effects.

Table of contents

1	Introduction	3
1.1	Overview	3
1.2	Estimand	3
1.3	Results	3
1.4	Why it matters	4
1.5	Telegraphing	4
1.6	Software	4
2	Data	5
2.1	Overview	5

*Code and data are available at: <https://github.com/xinqiyue/exchange-rate-analysis>.

2.2	Measurement	5
2.2.1	Canadian Dollar (CAD) and U.S. Dollar (USD) Exchange Rates	5
2.2.2	Bank Rates	5
2.2.3	Total BCPI	6
2.2.4	Energy BCPI	6
2.2.5	Metal BCPI	6
2.3	Data cleaning	7
2.4	Outcome variables	7
2.4.1	Weekly Average USD/CAD Exchange Rate	7
2.5	Predictor variables	7
2.5.1	Weekly Bank Rate	7
2.5.2	Weekly Total BCPI	9
2.5.3	Weekly Energy BCPI	9
2.5.4	Weekly Metal BCPI	11
3	Model	12
3.1	Model Set-Up	12
3.2	Model Justification	14
3.3	Assumptions	15
3.4	Limitations	15
3.5	Model Validation	16
4	Results	17
4.1	Model Performance	17
4.2	Coefficients and Interpretation	17
5	Discussion	18
5.1	Key Findings	19
5.2	Limitations	19
5.3	Future Research Directions	20
A	Appendix	21
A.1	Additional data details	21
A.2	Diagnostics	21
A.3	Additional Tables & Graphs	23
A.4	Idealized Methodology	24
A.4.1	Population and Sampling Approach	24
A.4.2	Data Collection and Measurement	25
A.4.3	Conclusion	27
A.5	Methodology Overview and Evaluation for BCPI data set	27
A.5.1	Data Collection and Processing Methodology	27
A.5.2	Strengths of the BCPI Methodology	28
A.5.3	Limitations of the BCPI Methodology	28

1 Introduction

1.1 Overview

The relationship between exchange rates, commodity prices, and interest rates is important in the economic dynamics of countries dependent on trade. For Canada, one of the world's largest commodity producers, the exchange rate of the Canadian dollar (CAD) against the U.S. dollar (USD) is influenced by multiple factors, including global commodity prices and domestic interest rates. These variables not only affect Canada's economic stability but also impact the broader global economy. Given Canada's close trade ties with the United States, particularly in energy and metals, understanding the relationship between these factors is important for policymakers, traders, and economists alike.

1.2 Estimand

The estimand of this analysis is the relationship between the USD/CAD exchange rate and four key predictors: the weekly bank rate, as well as the weekly BCPI indices (total, energy, and metal). The goal is to estimate how changes in the bank rate and fluctuations in global commodity prices, as captured by the BCPI, influence the value of the Canadian dollar relative to the U.S. dollar. Specifically, the analysis aims to quantify the effect of the bank rate on exchange rate movements and examine how the commodity prices (total, energy, and metal BCPI) contribute to the variability in the CAD/USD exchange rate.

1.3 Results

The analysis indicates that bank rates are positively associated with a depreciation of the Canadian dollar, which contradicts traditional economic theory. Commodity prices, particularly metal BCPI and total BCPI, are also positively related to a weaker Canadian dollar. However, energy BCPI shows a negative relationship with the exchange rate, suggesting that rising energy prices may help strengthen the Canadian dollar. Overall, higher bank rates and commodity prices are linked to a weaker Canadian dollar, with the effect of energy prices differing from other commodity indices.

1.4 Why it matters

Understanding the factors that influence the CAD/USD exchange rate is important for Canadian policymakers, as well as traders and economists. Since Canada is heavily reliant on exports, particularly in the energy and metal sectors, shifts in the exchange rate can have wide-reaching implications for trade, inflation, and economic growth. By understanding the impact of BCPI subcategories on the exchange rate, Canadian policymakers can make more informed decisions regarding monetary policy and economic strategy, ensuring greater stability in trade relations with the U.S.

1.5 Telegraphing

The structure of this paper is as follows: Section 1 provides an overview of the research topic and key objectives. In Section 2, we outline the data sources and variables used for the analysis, including details on exchange rates, interest rates, and commodity price indices. The Section 3 section describes the model setup and justifications for selecting specific variables and methodologies. In Section 4, we present the key findings of the regression analysis, including model performance and coefficient interpretations. The Section 5 section follows, where we explore the implications of the results, address potential limitations, and propose future research directions. Finally, Section A offer additional details on the data, model diagnostics, and methodology used in the study.

1.6 Software

This paper used R (R Core Team 2023) for data analysis, including data download and clean, regression diagnostics, model set up and summaries, and data visualization.

- **data cleaning** The tidyverse package was used for efficient data manipulation and visualization (Wickham et al. 2019), lubridate was employed for handling date-time operations (Grolemund and Wickham 2011), and arrow facilitated reading and writing large data sets in parquet format (Richardson et al. 2024).
- **visualization:** Ggplot2 (Wickham 2016), gridExtra (Auguie 2017), knitr(Xie 2024) and kableExtra (Zhu 2024) packages to generate and optimize the graphs and tables in this analysis.
- **model:** The car (Fox and Weisberg 2019) and modelsummary (Arel-Bundock 2022) packages were used for regression diagnostics and model summaries.

2 Data

2.1 Overview

For this study, three data sets were used to explore the relationship between the Canadian dollar (CAD) and U.S. dollar (USD) exchange rate, commodity prices (via the Bank of Canada Commodity Price Index - BCPI), and interest rates. The data was collected from multiple publicly available sources: weekly exchange rates between the CAD and USD, weekly BCPI data from the Bank of Canada, and the Bank of Canada's weekly interest rates. The exchange rate data set provides the value of the CAD against the USD (Canada n.d.), while the BCPI data set includes subcategories such as the total BCPI, energy BCPI, and metal BCPI (Canada n.d.). The interest rates data set provides the weekly bank rates set by the Bank of Canada (Canada n.d.). The BCPI is categorized into various types, with particular focus on energy and metal BCPI, as these sectors are main export areas for Canada.

2.2 Measurement

The data set used in this study includes variables related to exchange rates, bank rates, and the Bank of Canada Commodity Price Index (BCPI), which encompasses total, energy, and metal components. Below is a description of how these variables were measured and collected from their respective sources.

2.2.1 Canadian Dollar (CAD) and U.S. Dollar (USD) Exchange Rates

The exchange rate data was collected from the Bank of Canada's daily exchange rate series. These rates represent the average price at which one unit of U.S. dollars (USD) is exchanged for Canadian dollars (CAD), calculated from aggregated price quotes from financial institutions. In the data set, the exchange rates are represented as the number of Canadian dollars (CAD) per unit of U.S. dollars (USD).

2.2.2 Bank Rates

The weekly Bank Rate was sourced from the Bank of Canada's official rates for monetary policy operations. The weekly Bank Rate represents the benchmark interest rate set by the Bank of Canada and is used as a reference for short-term inter bank loans. This data was gathered as part of the broader data set on Canadian interest rates and monetary policy variables. The values are expressed as a percentage (%).

2.2.3 Total BCPI

The Total Bank of Canada Commodity Price Index (BCPI) represents the aggregated price of 26 commodities produced in Canada and traded globally. These commodities span sectors such as energy, metals and minerals, agriculture, forestry, and fisheries. The BCPI is calculated using the Chain Fisher price index methodology, which combines the advantages of both the Laspeyres and Paasche indices, providing a more accurate representation of price changes over time. This method uses the geometric mean of the price indices for successive periods, allowing for continuous updating of weights. The price movements of these commodities are measured in U.S. dollars, ensuring international comparability. The BCPI is computed using input-output (IO) tables by Statistics Canada, with the weights reflecting the relative importance of each commodity in Canada's economy. The index values are published with a base year of 1972, where the index value is set to 100 for that year.

2.2.4 Energy BCPI

The Energy BCPI includes the price movements of energy-related commodities such as crude oil, natural gas, and coal. The prices for these commodities are collected from a variety of sources, including the New York Mercantile Exchange (NYMEX) for oil and natural gas, and Kalibrate Canada Inc. for Western Canadian Select crude. The data is aggregated to form an index representing the overall price of energy commodities exported by Canada. The Energy BCPI is also measured in index points, with the same base year of 1972.

2.2.5 Metal BCPI

The Metal BCPI includes the price movements of metals and minerals such as gold, silver, copper, and nickel. The prices for these commodities are collected from the London Metal Exchange (LME) and other sources, such as the Handy and Harman base price for gold and silver. These prices are used to construct an index representing the overall price changes in the metal commodities produced in Canada. Similar to the Energy BCPI, the Metal BCPI is measured in index points with the base year set to 1972.

In summary, the measurement process involves collecting data from authoritative sources such as the Bank of Canada, the London Metal Exchange, and the New York Mercantile Exchange. The data is then processed into index points or percentage values to represent changes in exchange rates, interest rates, and commodity prices. The data is published on a regular basis with revisions made as new data becomes available.

2.3 Data cleaning

Variable Selection: The analysis focused on the following key variables: Weekly Bank Rate, Weekly Total BCPI, Weekly Energy BCPI, Weekly Metal BCPI, and Weekly Average USD/CAD Exchange Rate. These were selected for their relevance to the research question and their potential influence on the exchange rate.

Missing and Empty Values: Missing values and empty strings were identified and removed from the data sets both before and after merging.

Date and Data Type Conversion: Dates were standardized to ensure consistency across datasets. The BCPI values were converted to numeric types, and any non-numeric data was removed.

Bank Rate Aggregation: Daily bank_rate data was aggregated to weekly averages to match the temporal granularity of the other data sets.

Column Renaming: Columns were renamed for clarity to improve readability and ensure consistency across datasets.

Data set Merging: The data sets were merged by aligning the date column to create a unified data set.

2.4 Outcome variables

2.4.1 Weekly Average USD/CAD Exchange Rate

This variable represents the average exchange rate of the Canadian dollar (CAD) against the U.S. dollar (USD) over each week. It captures the value of one USD in terms of CAD.

Figure 1 illustrates the fluctuations in the exchange rate between the U.S. dollar (USD) and the Canadian dollar (CAD) from January 1, 2021, to November 27, 2024. While the exchange rate experiences fluctuations, the overall trend shows an increase, indicating that the value of the Canadian dollar relative to the U.S. dollar has been weakening over this period. In other words, more Canadian dollars are needed to purchase one U.S. dollar as time progresses.

2.5 Predictor variables

2.5.1 Weekly Bank Rate

Weekly Bank Rate represents the benchmark interest rate set by the Bank of Canada, typically used as a reference for short-term inter bank loans. This rate reflects the stance of monetary policy and plays a significant role in influencing exchange rates.

- **Unit:** Percentage (%).

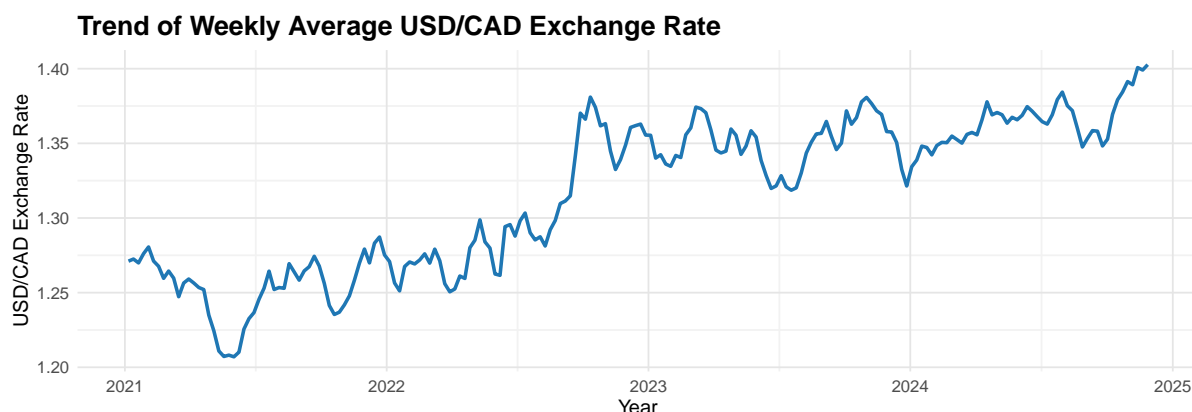


Figure 1: As time progresses, the amount of Canadian dollars (CAD) that can be exchanged for one U.S. dollar (USD) increases, indicating an overall decreasing trend in the value of the Canadian dollar relative to the U.S. dollar

Figure 2 shows the trends in the weekly bank rate from January 2021 to November 2024. The rate steadily increased over time, reaching its highest level between mid-2023 and mid-2024. After this peak, the rate began to decrease, suggesting a shift in monetary policy or economic conditions that led to a reduction in the bank rate. The fluctuations reflect changes in the central bank's approach to managing the economy during this period.

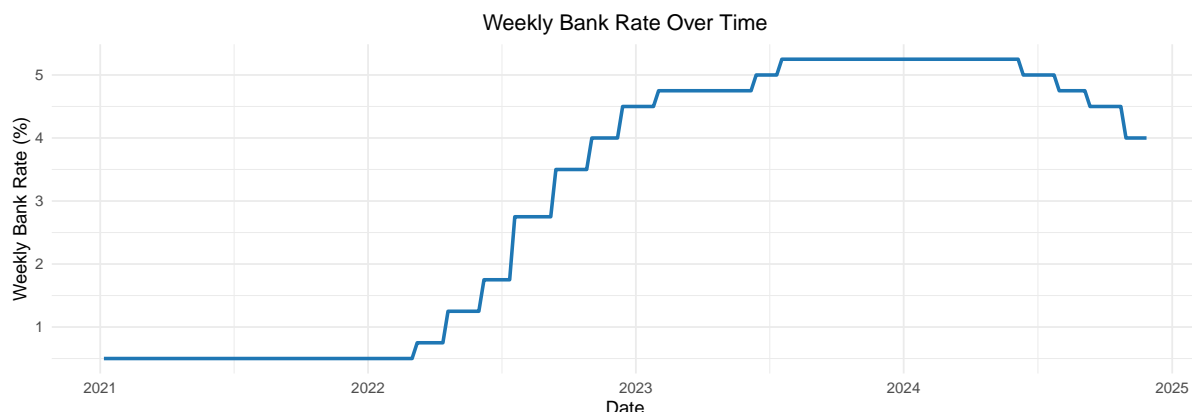


Figure 2: Weekly bank rate from 2021 to November 2024, showing an overall increase with a peak in mid-2023 to mid-2024, followed by a decline.

Figure 3 shows the relationship between the Weekly Bank Rate and the Weekly Average USD/CAD Exchange Rate. The data points show a positive trend, and the linear regression line suggests that as the weekly bank rate increases, the USD/CAD exchange rate also tends to rise. This indicates a positive correlation between the two variables. The upward slope of the regression line suggests that higher bank rates may have a tendency to push the exchange rate higher.

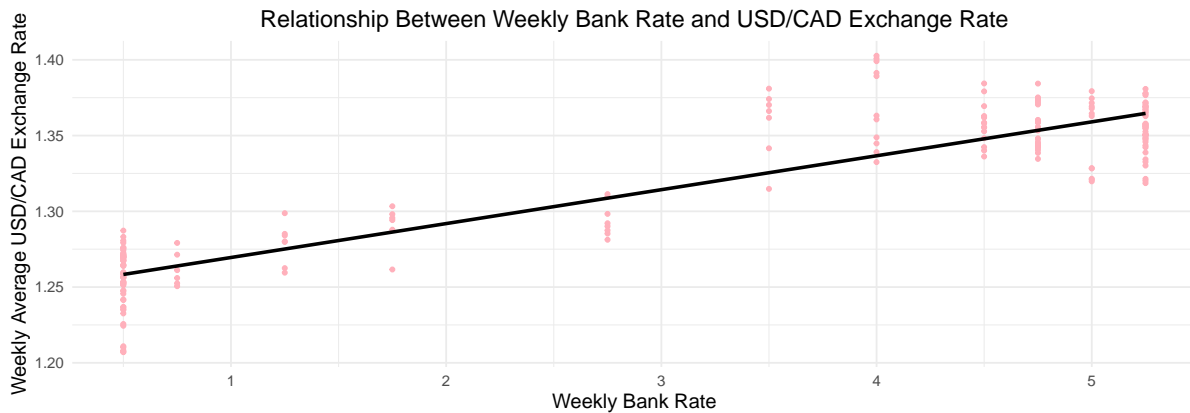


Figure 3: There is a positive relationship between the weekly bank rate and the USD/CAD exchange rate, with a linear regression line indicating upward trends.

2.5.2 Weekly Total BCPI

Weekly Total BCPI represents the overall Bank of Canada Commodity Price Index (BCPI), which aggregates the prices of 26 key commodities produced in Canada and traded globally. The total BCPI reflects fluctuations in the overall price of Canadian export commodities, affecting export revenues and currency value.

- **Unit:** Index Points (base year 1972 = 100).

Figure 4 presents a combined time-series plot of the Weekly Total BCPI and the Weekly Average USD/CAD Exchange Rate on the same timeline but with separate y-axes. The BCPI reaches its highest value around mid-2022 before experiencing a steady decline. Meanwhile, the USD/CAD exchange rate shows fluctuations throughout the observed period, with no apparent pattern that aligns with the BCPI's trends. This lack of correlation indicates that changes in the commodity price index do not directly correspond to movements in the exchange rate over time.

Figure 5 shows the relationship between the Weekly Total BCPI and the Weekly Average USD/CAD Exchange Rate. Each point represents an observed data point, with a linear regression line fitted to show the overall trend. The downward slope of the regression line indicates a negative relationship: as the Total BCPI increases, the USD/CAD exchange rate tends to decrease. This suggests that higher commodity prices might correspond to a stronger Canadian dollar (lower USD/CAD exchange rate).

2.5.3 Weekly Energy BCPI

Weekly Energy BCPI is defined as the price index of energy-related commodities such as crude oil, natural gas, and coal. Energy is one of the main sectors of Canada's exports, and changes

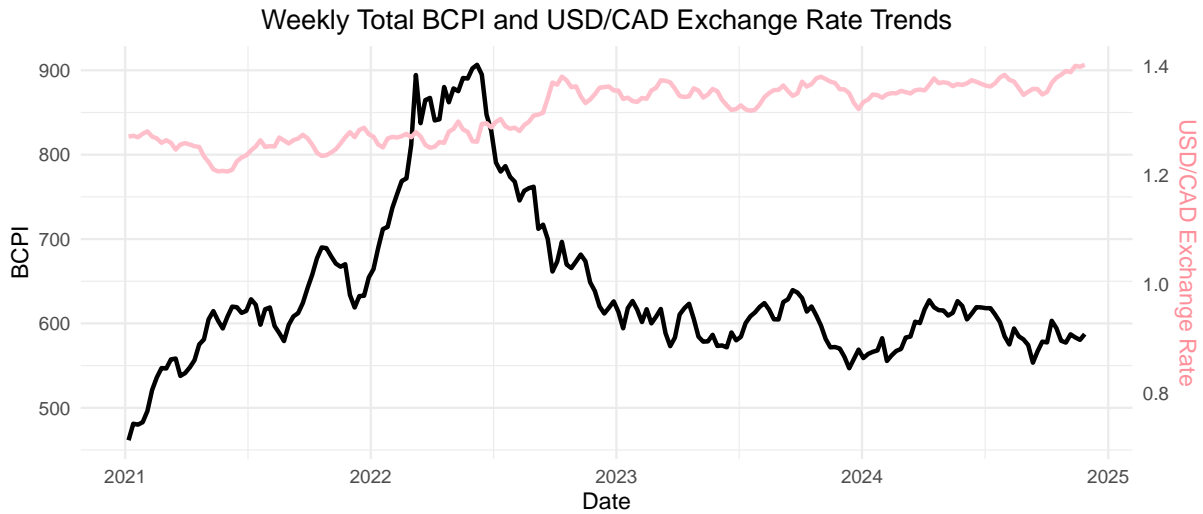


Figure 4: Weekly Total BCPI and USD/CAD exchange rate trends over time, with BCPI peaking in mid-2022 and declining after that. No clear relationship between the two variables is observed.

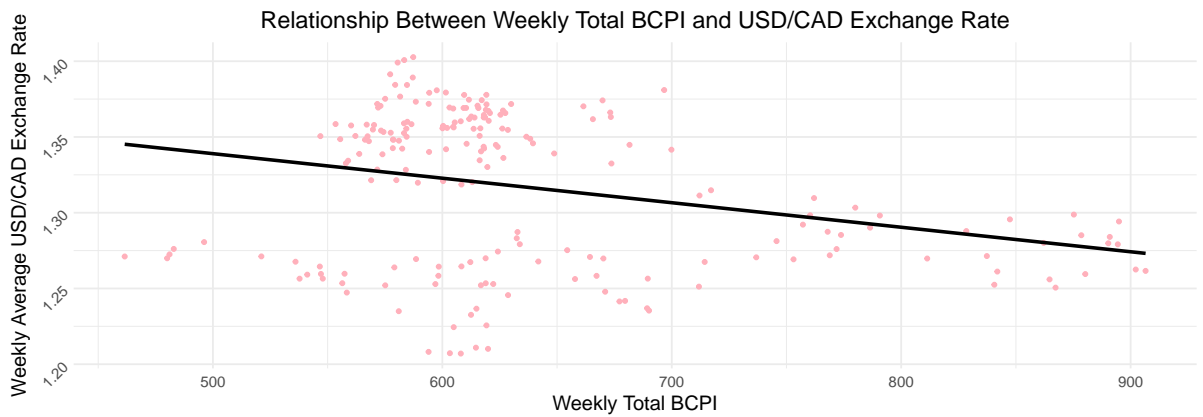


Figure 5: Relationship between the Weekly Total BCPI and the USD/CAD exchange rate, showing a downward trend in the fitted line.

in energy prices may impact Canada's economic performance and the strength of its currency.
- **Unit:** Index Points (base year 1972 = 100).

Figure 6 presents a dual y-axis plot displaying the Weekly Energy BCPI and the Weekly Average USD/CAD Exchange Rate. The Energy BCPI reaches its highest value around mid-2022 and gradually declines after that, showing a trend similar to the Total BCPI. The USD/CAD exchange rate fluctuates throughout the period, but there is no apparent direct relationship between the exchange rate and the Energy BCPI. This suggests that the changes in the energy-related BCPI do not correlate with fluctuations in the USD/CAD exchange rate during the observed time.

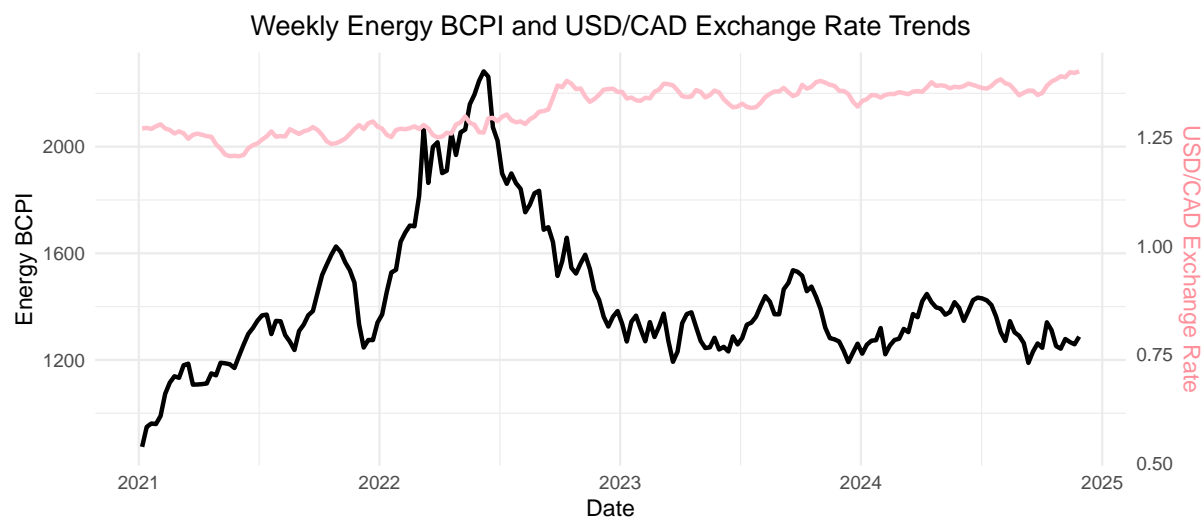


Figure 6: Weekly Energy BCPI and USD/CAD exchange rate trends over time, with Energy BCPI peaking in mid-2022 and declining after that. No clear relationship between the two variables is observed.

Figure 7 depicts the relationship between the Weekly Energy BCPI and the Weekly Average USD/CAD Exchange Rate. The regression line shows a slight negative slope, suggesting a weak inverse relationship between the two variables. As the Weekly Energy BCPI increases, the USD/CAD exchange rate tends to decrease slightly, though the correlation remains weak. Despite the visible trend, the scatter of data points indicates considerable variability, implying that other factors likely influence the exchange rate beyond the Energy BCPI.

2.5.4 Weekly Metal BCPI

Weekly Metal BCPI is the price index of metals and minerals such as gold, copper, nickel, and aluminum. These commodities are key components of Canada's mining sector, and their price volatility may indirectly influence exchange rates.

- **Unit:** Index Points (base year 1972 = 100).

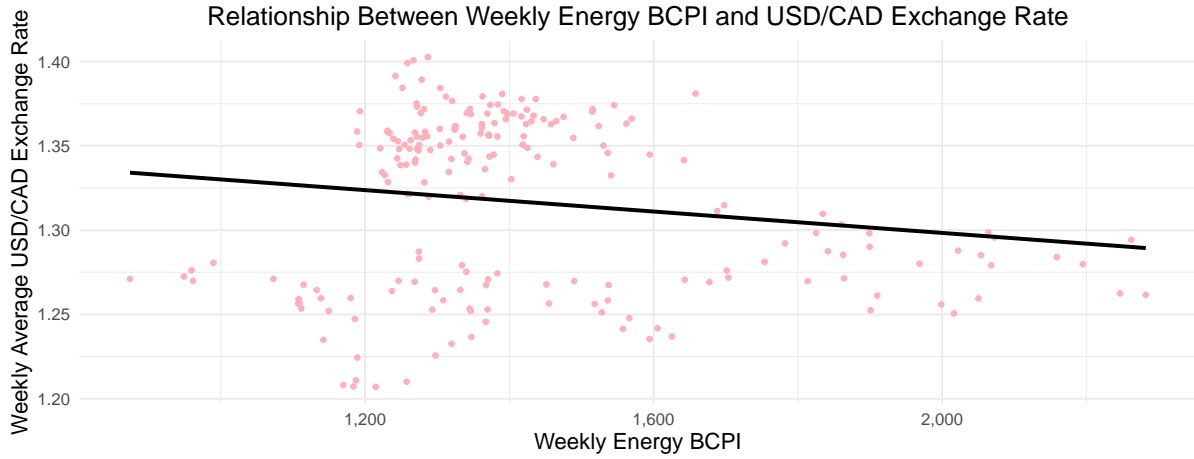


Figure 7: Relationship between Weekly Energy BCPI and Weekly Average USD/CAD Exchange Rate. The scatter plot shows a slight negative correlation between the two variables, with the regression line indicating a slight downward slope.

Figure 8 illustrates the relationship between Weekly Metal BCPI and the USD/CAD exchange rate over time. The Metal BCPI shows a clear upward trend at the beginning, peaking in March 2023, and then decreasing. By February 2024, the index almost reaches its lowest point, similar to its level in January 2021, before beginning to rise again. The USD/CAD exchange rate is plotted on the secondary y-axis, but no strong correlation is observed between the two variables, suggesting that fluctuations in the Metal BCPI may directly align with movements in the exchange rate over this period.

Figure 9 shows the relationship between Weekly Metal BCPI and the USD/CAD exchange rate. A clear downward trend is observed, with the linear regression line sloping negatively. This suggests that as the Weekly Metal BCPI increases, the USD/CAD exchange rate tends to decrease.

3 Model

3.1 Model Set-Up

This analysis aims to predict the USD/CAD exchange rate using four key economic variables: bank rate, metal BCPI, energy BCPI, and total BCPI. We employ a multiple linear regression model to examine how these predictors relate to the exchange rate and identify the most significant drivers for currency fluctuations.

We define the model as follows:

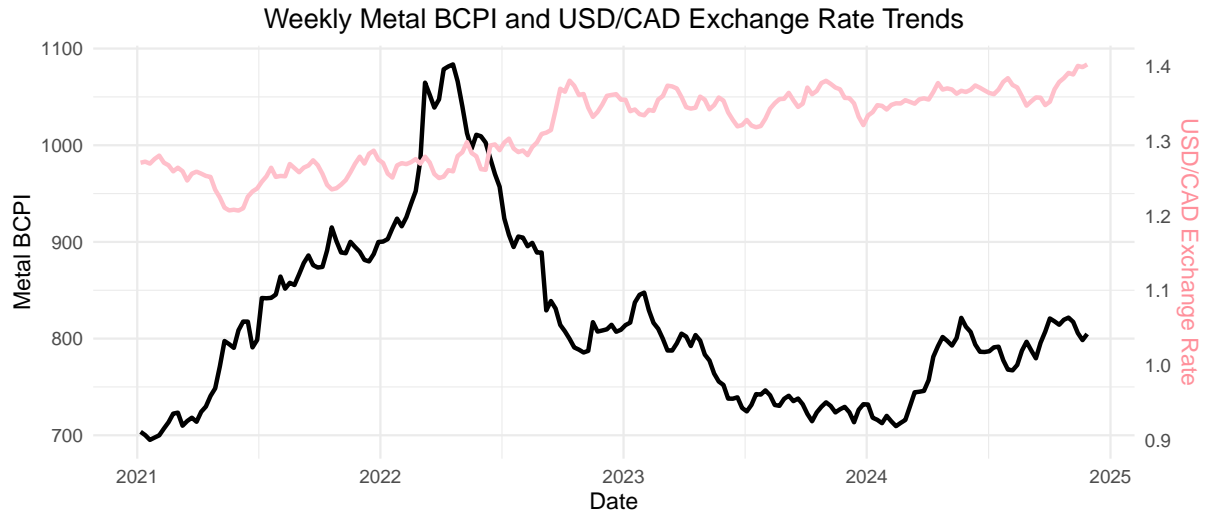


Figure 8: The trends of Weekly Metal BCPI and the USD/CAD exchange rate, with the Metal BCPI showing an increase until peaking around March 2023, followed by a decline, almost reaching its lowest point in February 2024 before starting to rise again. No clear relationship between the two variables is observed from this graph.

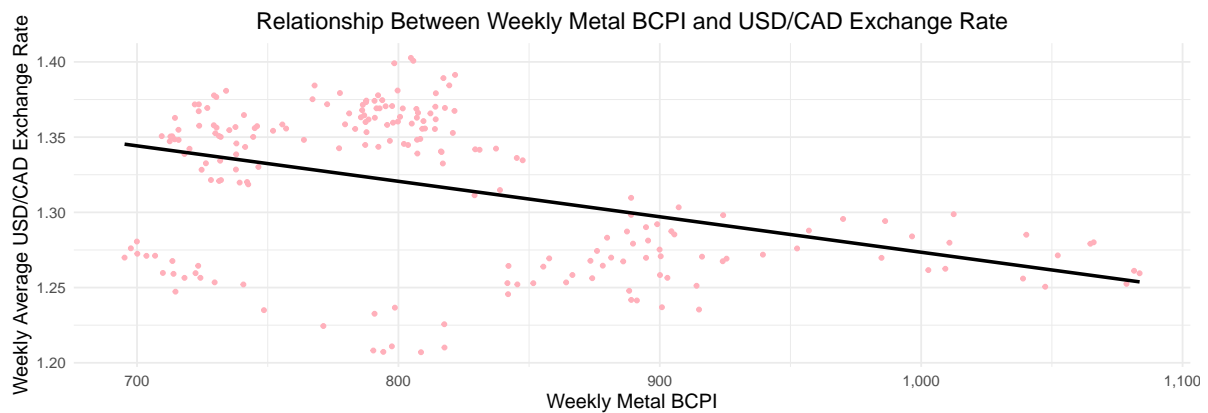


Figure 9: There is a negative relationship between Weekly Metal BCPI and the USD/CAD exchange rate, with a downward slope in the linear regression line indicating an inverse trend.

$$\text{USD/CAD}_t = \beta_0 + \beta_1 \cdot \text{Bank Rate}_t + \beta_2 \cdot \text{Metal BCPI}_t + \beta_3 \cdot \text{Energy BCPI}_t + \epsilon_t$$

$$\text{USD/CAD}_t = \beta_0 + \beta_1 \cdot \text{Bank Rate}_t + \beta_4 \cdot \text{Total BCPI}_t + \epsilon_t$$

Where:

- USD/CAD_t is the predicted exchange rate at time t
- β_0 is the intercept term
- $\beta_1, \beta_2, \beta_3, \beta_4$ represent the coefficients for each predictor (bank rate, metal BCPI, energy BCPI, total BCPI)
- ϵ_t is the error term at time t .

This model quantifies the relationship between the exchange rate and the four predictors, allowing us to evaluate when the exchange rate is most favorable for converting Canadian dollars to U.S. dollars.

3.2 Model Justification

We chose linear regression (LM) over models like GLM, Bayesian methods, and logistic regression for the following reasons:

1. **Simplicity and Interpretability:** Linear regression is simple and its coefficients provide clear, direct interpretation of how predictors affect the dependent variable. More complex models would complicate this understanding.
2. **Data Compatibility:** The response variable is continuous, making linear regression the best fit. GLM and logistic regression would not be suitable, as GLM requires assumptions about the error distribution and link functions, while logistic regression is for binary outcomes.
3. **Computational Efficiency:** Linear regression is computationally efficient and quick to fit, whereas Bayesian and GLM approaches require more resources and time.
4. **Assumption Fit:** Diagnostic tests confirmed that linear regression assumptions (linearity, homoscedasticity, normal residuals) were met, making it a good fit for the data set.

Overall, linear regression is the most effective model for this analysis due to its simplicity, speed, and adequacy for continuous data.

3.3 Assumptions

1. **Linearity:** We assume that the relationship between the predictors (bank rate, metal BCPI, energy BCPI, and total BCPI) and the dependent variable, the weekly USD/CAD exchange rate, is linear. From Figure 11, both models show no clear pattern, supporting the linearity assumption.
2. **Independence of Errors:** The residuals in the model are assumed to be independent of one another. This means that there is no autocorrelation between consecutive residuals, which is a typical assumption in time series modeling. Violations of this assumption could indicate that the model has not captured some form of time dependency (e.g., lagged effects of one predictor on another), which may require adjustments such as the inclusion of lag terms or a more appropriate time-series model. From Figure 13, both models do not exhibit a discernible trend, suggesting that the independence assumption is satisfied.
3. **Homoscedasticity:** The residuals (ϵ_t) are assumed to be independent and identically distributed with constant variance (homoscedasticity). From Figure 11, we know the assumption is satisfied since the plot shows a random scatter of points with no discernible pattern, which indicates that the variance is constant.
4. **No Multicollinearity:** The predictors used in the model are assumed not to be highly correlated with each other. High correlation between predictors can lead to multicollinearity, which can inflate the variance of the coefficient estimates and make it difficult to determine the individual effect of each predictor on the exchange rate. From Figure 14 and Figure 15, the Variance Inflation Factor (VIF) are low, which means the assumption is satisfied.
5. **Normality of Residuals:** The residuals of the model are assumed to be normally distributed. From Figure 12, the QQ plot is approximately a straight line, which indicates that the assumption is satisfied for both of the model.

3.4 Limitations

1. **Exclusion of Important Variables:** The models only includes 4 predictors (bank rate, metal BCPI, energy BCPI, and total BCPI), omitting other relevant variables that could influence the USD/CAD exchange rate. Factors such as geopolitical events, inflation rates, oil prices, and global market sentiment may lead to fluctuations in currency but are not accounted for in the current model. This exclusion could limit the model's ability to capture the full range of drivers influencing exchange rates.
2. **Simplified Assumptions:** The model assumes linear relationships between predictors and the dependent variable, which may not fully reflect the complexity of real-world exchange rate dynamics. Economic relationships can often be non-linear, and there may

be interactions between predictors (e.g., the combined effects of bank rates and BCPI on exchange rates) that are not captured in this linear model. Further exploration of interaction terms or more complex modeling techniques (e.g., non-linear models) could provide a more accurate representation of the underlying dynamics.

3. **Lack of Robustness to Structural Changes:** Economic structures and market dynamics can change due to factors like policy shifts, technological advancements, or economic crises. This model may not be robust to such structural breaks, and its performance could deteriorate if significant changes in the economic environment occur.

3.5 Model Validation

- **Out of Sample test:** To evaluate the models' ability to generalize to unseen data, we performed out-of-sample testing by splitting the dataset into training (80%) and testing (20%) sets. From Figure 10, the First Model, which includes `weekly_bank_rate`, `weekly_metal_bcpi`, and `weekly_energy_bcpi`, achieved an RMSE of 0.0231 and an MAE of 0.0168, outperforming the Second Model (which includes `weekly_bank_rate` and `weekly_total_bcpi`) with an RMSE of 0.0239 and an MAE of 0.0174. These results suggest that the First Model provides slightly better predictive accuracy by capturing the distinct effects of the BCPI components.

Model	RMSE	MAE
First Model	0.0231	0.0168
Second Model	0.0239	0.0174

Figure 10: Comparison of prediction performance between two regression models using RMSE and MAE metrics. The First Model, which includes bank rate, metal BCPI, and energy BCPI as predictors, performs slightly better (RMSE = 0.0231, MAE = 0.0168) than the Second Model, which includes bank rate and total BCPI (RMSE = 0.0239, MAE = 0.0174). This suggests that including disaggregated BCPI components may improve model accuracy.

- **Multicollinearity Check:** Figure 14 and Figure 15 shows low Variance Inflation Factor (VIF) values for all predictors in both models, ensuring that the variables are not highly correlated. This indicates that the coefficient estimates are stable and interpretable, allowing us to identify the individual contributions of predictors to the exchange rate.
- **Model Summary:** From Table 1, Both models demonstrated strong overall fit, with R^2 values of 0.831 and 0.824, respectively, and adjusted R^2 values slightly lower due to model complexity. The inclusion of additional predictors in the First Model results in slightly higher explanatory power. The Akaike Information Criterion (AIC) and Bayesian Information Criterion (BIC) also indicate that the First Model performs better despite

its increased complexity. The residual standard errors are similar, reflecting consistent performance across both models.

4 Results

The primary objective of this analysis was to investigate the key drivers of the USD/CAD exchange rate, focusing on the influence of interest rates, metal BCPI, energy BCPI, and total BCPI. To achieve this, we developed two multiple linear regression models to predict the weekly exchange rate and assess the impact of these economic variables.

4.1 Model Performance

Both models performed well in terms of predictive accuracy. By Figure 10, the first model (which includes metal and energy BCPI) had an RMSE of 0.0231 and an MAE of 0.0168, while the second model (which includes total BCPI) showed an RMSE of 0.0239 and an MAE of 0.0174. Given that these values are relatively low and similar across both models, it indicates that the models are accurate in predicting the USD/CAD exchange rate, with only minor differences in performance.

4.2 Coefficients and Interpretation

1. **Bank Rate:** By Table 1, both models show a positive relationship between the **bank rate** and the exchange rate. In the first model, a 1% increase in the **bank rate** results in a 0.0241 increase in the exchange rate, and the second model shows a 0.0224 increase. This suggests that a higher **bank rate** tends to lead to a weaker Canadian dollar, as the exchange rate rises. This relationship is somewhat counterintuitive, as traditional economic theory suggests that higher interest rates should strengthen the currency. This observation will be further discussed in the Section 5.
2. **BCPI Components (Metal, Energy, and Total):** From Table 1, the coefficients for the BCPI components are quite small but still statistically significant:
 - **Metal BCPI:** A 1-point increase in the **metal BCPI** results in a 0.0001 increase in the exchange rate.
 - **Energy BCPI:** A 1-point increase in the **energy BCPI** leads to a decrease of 0.00002 in the exchange rate.
 - **Total BCPI:** A 1-point increase in the **total BCPI** results in a 0.000003 increase in the exchange rate.

Table 1: Comparison of two regression models for the CAD/USD exchange rate. The weekly bank rate and metal BCPI have positive coefficients, indicating a depreciation effect on the Canadian dollar, while energy BCPI shows a negative coefficient, suggesting an appreciation effect. Total BCPI has minimal impact. Both models demonstrate strong explanatory power, with R^2 values above 0.82.

	First Model	Second Model
(Intercept)	1.192 735 (0.019 979)	1.244 889 (0.012 093)
weekly_bank_rate	0.024 073 (0.000 928)	0.022 431 (0.000 772)
weekly_metal_bcpi	0.000 100 (0.000 035)	
weekly_energy_bcpi	−0.000 023 (0.000 010)	
weekly_total_bcpi		0.000 003 (0.000 017)
Num.Obs.	204	204
R2	0.831	0.824
R2 Adj.	0.829	0.822
AIC	−994.2	−987.9
BIC	−977.6	−974.6
Log.Lik.	502.099	497.961
RMSE	0.02	0.02

Although the coefficients for BCPI components are relatively low, this could be attributed to the large range and average values of these indices as shown in Figure 16. The **weekly energy BCPI** in particular has a broad span, with values ranging from 874.12 to over 2282.35. Thus, these results still indicate that commodity prices have a noticeable influence on the exchange rate.

5 Discussion

This study aimed to investigate the factors influencing the USD/CAD exchange rate, with a particular focus on the role of interest rates and commodity prices, as measured by the Bank of

Canada's Commodity Price Index (BCPI). We used regression analysis to assess the relationship between the exchange rate and variables such as the bank rate, BCPI categories (total, energy, and metal). Based on the findings, this section will discuss the findings, limitations, and potential directions for future research.

5.1 Key Findings

This paper explored the relationship between the **bank rate**, **commodity prices**, and the USD/CAD exchange rate. The results suggest that the **bank rate** and **commodity price indices** are significant factors influencing exchange rate fluctuations. Notably, the **bank rate** has a positive relationship with the USD/CAD exchange rate, indicating that higher rates are associated with a weaker Canadian dollar. This outcome is contrary to traditional economic theory, where we would expect higher interest rates to lead to a stronger currency.

However, the observed results may be driven by complex underlying factors that were not captured by the model. Specifically, one potential explanation for this unexpected finding lies in **causal relationships**. In economic studies, it is often difficult to definitively establish the direction of causality between variables. Although theory suggests that higher interest rates should attract capital inflows and thus appreciate the domestic currency, in reality, it is possible that exchange rate fluctuations themselves may prompt adjustments in the **bank rate**. For example, the central bank might alter interest rates in response to exchange rate pressures to stabilize the economy.

5.2 Limitations

- **Omitted Variables:** One limitation of this study is the potential for **omitted variables** that could influence the USD/CAD exchange rate. For example, the analysis did not consider factors such as **economic growth**, **global political events**, or **international trade relations**, all of which can significantly affect the value of a currency. The exclusion of these factors might have led to an incomplete understanding of the exchange rate dynamics.
- **Causality Issues:** Another limitation arises from the difficulty of establishing clear **causal relationships** between the variables. While the model suggests that higher interest rates correlate with a weaker Canadian dollar, it is also possible that fluctuations in the exchange rate could influence the interest rate decisions, creating a **reverse causality**. For example, the Canadian central bank might adjust the bank rate in response to exchange rate pressures, rather than exchange rates reacting directly to changes in interest rates.
- **Lag Effects:** The model did not account for potential **lag effects** of interest rate changes on exchange rates. It is hard for monetary policy actions, such as changes in interest rates, to have an immediate impact on the economy and the exchange rate. The

effects of interest rate adjustments might take several periods to materialize fully. Future models could consider the inclusion of lagged variables to capture these delayed effects.

- **Economic Context:** The study did not fully explore the broader macroeconomic context in which the exchange rate operates. Factors such as the fiscal policies, global economic conditions, and geopolitical events in USA could have significant impacts on the USA/CAD exchange rate but were not included in the model. These factors should be considered in future research to provide a more comprehensive understanding of exchange rate movements.

5.3 Future Research Directions

- **Expanding the Model:** Future research could incorporate additional variables, such as economic growth, trade balances, and global economic indicators, to provide a more complete picture of the factors affecting the USD/CAD exchange rate.
- **Causal Analysis:** Exploring the causal relationships between interest rates and exchange rates through more complex models (e.g., Granger causality tests or vector autoregression models) could provide clearer evidence on how these variables interact over time.
- **Exploring Lagged Effects:** Incorporating lagged variables for interest rates and other key indicators could help better capture the delayed effects of monetary policy on exchange rates.
- **Global Context:** Future studies could examine the effects of global economic conditions and geopolitical factors on the exchange rate, which would allow for a deeper understanding of the broader context in which the USD/CAD exchange rate is determined.

A Appendix

A.1 Additional data details

A.2 Diagnostics

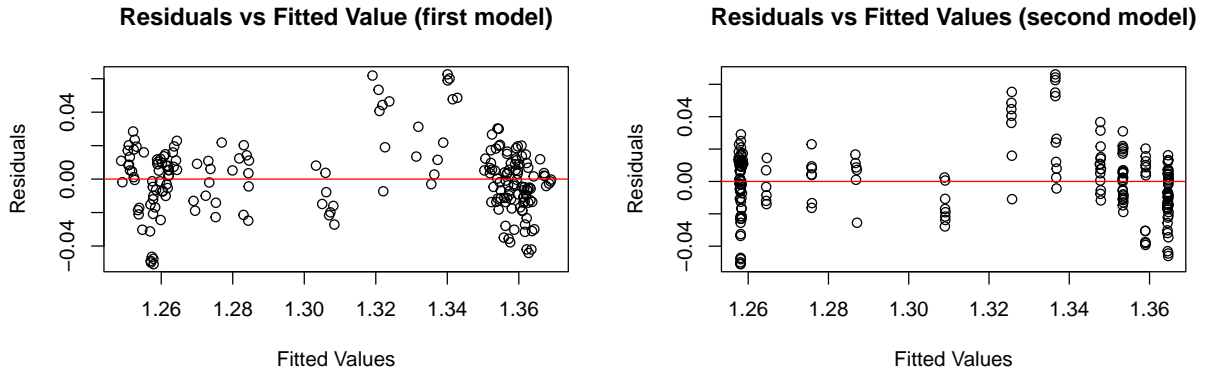


Figure 11: Residuals vs Fitted Values for the first (left) and second (right) models. The residuals are evenly distributed around zero, indicating no clear pattern, which supports the assumption of homoscedasticity (constant variance).

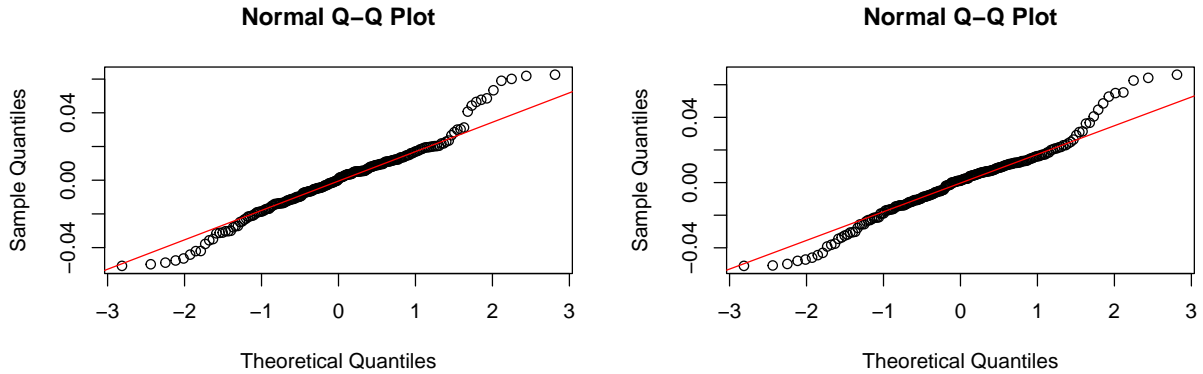


Figure 12: Normal Q-Q Plots for the first (left) and second (right) models. The points closely align with the diagonal line, supporting the assumption that residuals follow a normal distribution.

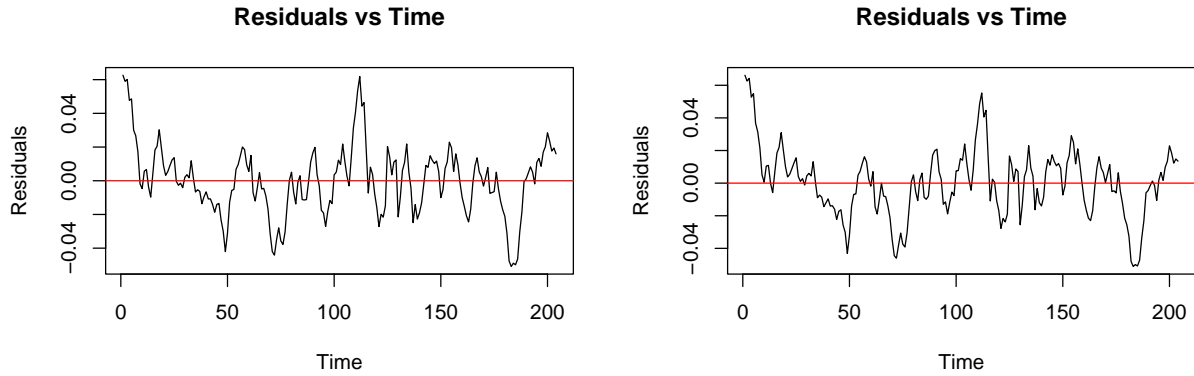


Figure 13: Residuals vs Time for the first (left) and second (right) models. The residuals fluctuate randomly around zero over time, showing no clear trends, which supports the assumption of no autocorrelation in the residuals

	vif_result
weekly bank rate	1.678
weekly metal BCPI	4.616
weekly energy BCPI	3.525

Figure 14: Variance Inflation Factor (VIF) values for all predictors in the first models are below 5, indicating that multicollinearity is not a concern in these models.

	vif_result2
weekly bank rate	1.122
weekly total BCPI	1.122

Figure 15: Variance Inflation Factor (VIF) values for all predictors in second models are below 5, indicating that multicollinearity is not a concern in these models.

A.3 Additional Tables & Graphs

	min	max	mean	variance
weekly bank rate	0.50	5.25	3.10	4.17
weekly average USD/CAD	1.21	1.40	1.32	0.00
weekly total BCPI	461.55	906.53	638.12	8,391.82
weekly energy BCPI	874.12	2,282.35	1,424.63	69,754.38
weekly metal BCPI	695.24	1,083.57	817.05	8,093.77

Figure 16: Summary statistics for key variables in the analysis, including weekly bank rate, USD/CAD exchange rate, and BCPI categories (total, energy, and metal), showing minimum, maximum, mean, and variance

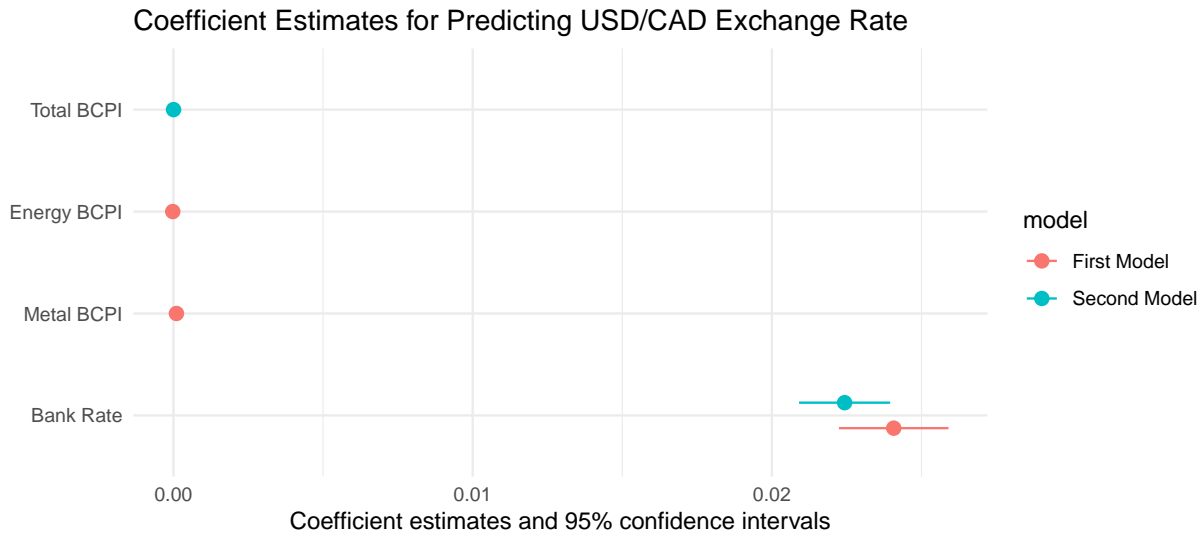


Figure 17: Visualization of coefficient estimates and 95% confidence intervals from two regression models predicting the USD/CAD exchange rate. The weekly bank rate shows a consistent and significant positive impact, while the BCPI categories exhibit smaller effects. Energy BCPI has a slightly negative estimate, indicating a potential appreciating influence on the Canadian dollar, while metal BCPI has a small positive effect. Total BCPI demonstrates minimal influence.

A.4 Idealized Methodology

This study aims to analyze the impact of commodity prices, interest rates, and key economic events on the USD/CAD exchange rate. The current dataset, based on weekly data, has limitations, including an inability to capture short-term fluctuations and reliance on a single commodity price index (BCPI) that may not cover all relevant price movements. Additionally, the Bank of Canada's bank rate is used as a proxy for interest rates, but it may not reflect other rates affecting investments, such as consumer or business loan rates. These limitations could affect the accuracy of the analysis.

A.4.1 Population and Sampling Approach

The **target population** consists of all economic factors that influence the USD/CAD exchange rate, including commodity prices, interest rates, and exchange rates. The **sampling frame** will include data from international financial markets, central banks, and commodity markets, focusing on:

- Commodity prices from various sectors (energy, metals, agriculture).
- Interest rates from central banks and financial institutions.

- Exchange rates from multiple financial sources.

The **sampling frame** will include data sources such as central banks, commodity markets, financial institutions, and global news platforms. Data will be sampled across various time periods to capture long-term trends and short-term fluctuations.

We will use a **stratified sampling** method to ensure that the data represent all key sectors, interest rates, and exchange rate sources. The focus will be on: - Price level: Different commodities (energy, metals, agriculture, etc.). - Interest rate: Various interest rate types (e.g., central bank rates, consumer and business loan rates). - Exchange rates: Real-time exchange rates from multiple financial institutions.

A.4.2 Data Collection and Measurement

To address the limitations of the current dataset, the following improvements are proposed:

1. Higher-Frequency Data:

- **Exchange Rates:** Daily exchange rate data for CAD/USD will be collected from financial platforms like Bloomberg, Reuters, and central banks (e.g., Bank of Canada). This will include rates from multiple institutions (e.g., commercial banks, currency exchanges).
 - **Interest Rates:** Data on consumer loan rates, business loan rates, and global interest rates (e.g., U.S. Federal Reserve rates, European Central Bank rates) will be collected from central banks, commercial banks, and financial platforms.
- Variables Collected:**

- **Exchange rates:** CAD/USD rates from multiple sources, such as commercial banks, forex markets, and central banks.
- **Interest rates:** Data on various types of interest rates: Bank of Canada's overnight rate, U.S. Federal Reserve's rate, consumer loan rates, business loan rates, and global bond yields.

Advantage: These data points will capture daily market fluctuations, allowing for a more granular view of interest rate and exchange rate dynamics.

2. Expanded Commodity Price Data:

- In addition to the BCPI, we will collect data from the **Global Commodity Price Index (GCPI)** and sector-specific indices (e.g., oil prices, natural gas, precious metals, and agricultural products). This will include daily or weekly prices from global commodity exchanges like the New York Mercantile Exchange (NYMEX) and London Metal Exchange (LME).

Variables Collected:

- **Commodity prices:** Daily or weekly prices for energy commodities (oil, natural gas), metals (gold, silver, copper), and agricultural products (wheat, corn, soybeans).
- **Commodity index values:** GCPI and sector-specific price indices for comprehensive market coverage.

Advantage: This will provide a more accurate representation of how fluctuations in various commodity markets affect exchange rates.

3. Event-Driven Data:

- Major events, such as **U.S. presidential elections**, **trade policy changes**, and **commodity price shocks**, will be tracked. These events will be identified through news outlets, government reports, and financial news platforms. The impact of these events on the CAD/USD exchange rate will be measured by examining pre- and post-event exchange rate movements.

Variables Collected:

- **Event indicators:** Data will include timestamps for events like U.S. elections, trade agreements, and major commodity price changes.
- **Exchange rate reactions:** Immediate changes in exchange rates before and after significant events.

Advantage: This will allow for direct analysis of how geopolitical and economic events affect currency markets.

4. Real-Time Data:

- Real-time exchange rates and interest rates will be obtained from financial platforms like Bloomberg, Reuters, and government releases. This will include high-frequency data (e.g., every minute or hourly data) to capture immediate market reactions to economic news and events.

Variables Collected:

- **Real-time exchange rates:** CAD/USD exchange rate data collected from multiple financial institutions in real-time.
- **Real-time interest rates:** Instant updates on global interest rates, especially from major central banks and commercial financial entities.

Advantage: Real-time data will enable precise analysis of short-term fluctuations and market responses to economic news.

A.4.3 Conclusion

The idealized methodology will improve upon the current dataset by incorporating higher-frequency data on exchange rates and interest rates, expanding commodity price coverage, and integrating event-driven data to assess the influence of global events. These improvements will address the limitations of the existing weekly data and provide a more detailed and accurate analysis of the factors driving the CAD/USD exchange rate.

A.5 Methodology Overview and Evaluation for BCPI data set

The Bank of Canada Commodity Price Index (BCPI) uses a chain Fisher price index to track the transaction prices of 26 commodities produced in Canada and sold in global markets. These commodities cover a wide range of categories, including energy, metals, minerals, forestry, agriculture, and fisheries. The BCPI employs several data sources and methodologies to construct its index.

A.5.1 Data Collection and Processing Methodology

The BCPI relies on data primarily from Statistics Canada’s input-output (IO) tables, with supplementary sources used when IO disaggregation is insufficient. The key methodology steps include:

- **Commodity Prices:** The BCPI tracks spot or transaction prices in U.S. dollars for individual commodities. These prices are averaged over specific time periods (e.g., daily, weekly, monthly) to account for price fluctuations.
- **Weighting:** The weight of each commodity in the index is derived from Canadian production values, which are adjusted over time using data from various sources such as the National Energy Board and Statistics Canada. The methodology incorporates changes in commodity prices and proxies for production volume.
- **Projection of Weights:** The current methodology projects weights forward from the Input-Output reference year (2018) by approximating commodity value changes through commodity price adjustments and production volume proxies. Weights are reassessed four times a year to reflect the most recent price projections.
- **Revisions and Adjustments:** The methodology also allows for historical revisions when more up-to-date data becomes available. For instance, the coal price series and some agricultural prices have undergone revisions in the past.

A.5.2 Strengths of the BCPI Methodology

The BCPI methodology has several strengths:

1. **Coverage:** By tracking a wide range of commodities, the BCPI provides an overview of Canadian market trends.
2. **Regular Updates:** The BCPI supports weekly, quarterly and annually updates, ensuring that the weights and data reflect the short-term and long-term current price and production trends.
3. **Use of Reliable Sources:** The index relies on reputable and recognized data sources, including Statistics Canada, the National Energy Board, and the New York Mercantile Exchange, enhancing the reliability and credibility.
4. **Transparent Weighting Methodology:** The approach for determining commodity weights through production values and price proxies is transparent and well-documented, allowing users to understand how the index is constructed.

A.5.3 Limitations of the BCPI Methodology

1. **Lag in Data Availability:** Since the index uses input-output tables that are updated with a lag, the most recent data may not always be included in the BCPI, potentially leading to outdated weights.
2. **Dependence on Proxy Data:** For certain commodities, production volumes are estimated using proxies, which may not always fully capture the complexities of Canadian commodity production, especially in sectors with high variability or limited data.
3. **Historical Data Revisions:** The revision of past data, such as changes to coal price series or shifts in the source of barley prices, could cause inconsistencies in historical comparisons, requiring caution when using the BCPI for longitudinal analysis.
4. **Commodity Price Volatility:** The BCPI is sensitive to fluctuations in commodity prices, which can be influenced by a wide range of global factors. This volatility could lead to large swings in the index over short periods, making it challenging to capture long-term trends.

Overall, the BCPI methodology provides useful information on Canadian pricing. However, its effectiveness may be impacted by data lags, the use of proxies for commodity production volumes, and periodic revisions.

References

- Arel-Bundock, Vincent. 2022. “modelssummary: Data and Model Summaries in R.” *Journal of Statistical Software* 103 (1): 1–23. <https://doi.org/10.18637/jss.v103.i01>.
- Auguie, Baptiste. 2017. *gridExtra: Miscellaneous Functions for “Grid” Graphics*. <https://CRAN.R-project.org/package=gridExtra>.
- Canada, Bank of. n.d. “Canadian Interest Rates and Monetary Policy Variables: 10-Year Lookup.” <https://www.bankofcanada.ca/rates/interest-rates/canadian-interest-rates/>.
- . n.d. “Commodity Price Index.” <https://www.bankofcanada.ca/rates/price-indexes/bcpi/>.
- . n.d. “Daily Exchange Rates.” <https://www.bankofcanada.ca/rates/exchange/daily-exchange-rates/>.
- Fox, John, and Sanford Weisberg. 2019. *An R Companion to Applied Regression*. Third. Thousand Oaks CA: Sage. <https://socialsciences.mcmaster.ca/jfox/Books/Companion/>.
- Grolemund, Garrett, and Hadley Wickham. 2011. “Dates and Times Made Easy with lubridate.” *Journal of Statistical Software* 40 (3): 1–25. <https://www.jstatsoft.org/v40/i03/>.
- R Core Team. 2023. *R: A Language and Environment for Statistical Computing*. Vienna, Austria: R Foundation for Statistical Computing. <https://www.R-project.org/>.
- Richardson, Neal, Ian Cook, Nic Crane, Dewey Dunnington, Romain François, Jonathan Keane, Dragoş Moldovan-Grünfeld, Jeroen Ooms, Jacob Wujciak-Jens, and Apache Arrow. 2024. *Arrow: Integration to ‘Apache’ ‘Arrow’*. <https://CRAN.R-project.org/package=arrow>.
- Wickham, Hadley. 2016. *Ggplot2: Elegant Graphics for Data Analysis*. Springer-Verlag New York. <https://ggplot2.tidyverse.org>.
- Wickham, Hadley, Mara Averick, Jennifer Bryan, Winston Chang, Lucy D’Agostino McGowan, Romain François, Garrett Grolemund, et al. 2019. “Welcome to the tidyverse.” *Journal of Open Source Software* 4 (43): 1686. <https://doi.org/10.21105/joss.01686>.
- Xie, Yihui. 2024. *Knitr: A General-Purpose Package for Dynamic Report Generation in r*. <https://yihui.org/knitr/>.
- Zhu, Hao. 2024. *kableExtra: Construct Complex Table with ‘Kable’ and Pipe Syntax*. <https://CRAN.R-project.org/package=kableExtra>.