Bank Loans and Monetary Aggregates: Seasonal Adjustment for Colombia

September 6, 2021*

1 Introduction

This document makes an analysis of seasonal patterns for Currency (C), Monetary Base (MB), M1, Deposits held by the public, M3, Consumer and Corporate loans, and Gross adjusted loans ¹. Monetary aggregates sample starts in January 1984 while loan series start in May 2002.

In order to make the seasonal analysis and adjustment, TRAMO-SEATS and X13-ARIMA-SEATS procedures were proved, using a specialized statistical software named JDemetra \pm .

TRAMO-SEATS is a model-based procedure, developed by Gómez and Maravall (1998), that consists of two programs: Time series Regression with ARIMA noise, Missing observations and Outliers (TRAMO) and Signal Extraction in ARIMA Time Series (SEATS). The first one performs estimation, forecasting and interpolation of regression models with missing observations and ARIMA errors and takes into account the presence of outliers. SEATS performs an ARIMA-based decomposition into unobserved components ³.

On the other hand, X13-ARIMA-SEATS is a seasonal adjustment program developed by the U.S. Census Bureau that takes into account two modules, an enhanced X11 and an ARIMA model-based procedure (SEATS) ⁴.

Colombian calendar is introduced in JDemetra+ to look for calendar effects such as

^{*}From the statistics with a cut-off to August 2020, certificates of deposits (CDTs) and bonds held by the Banco dela Republica were excluded, and the series was reprocessed from March 2020 to date. This change affects the M3 and the Deposits held by the public.

¹Data adjusted by mortgage loans securitization and operating lease.

²JDemetra+ is an statistical software of seasonal adjustment, created by the *European Statistical System*(EUROSTAT). The Seasonal Adjustment Steering Group recommended it for analysis procedures and seasonal treatment on December, 2014.

³More information about methodology can be found in Caporello et al. (2001).

⁴More information about methodology can be found in https://www.census.gov/srd/www/x13as/

working or trading days, as well as Easter. Inclusion of these variables is tested during the seasonal adjustment process. Significant calendar and outliers variables are included in the final model.

A special procedure is implemented in the reestimation done on October 2020, in order to take into account the effects of the Covid-19 shock. Additionally, the X13-ARIMA-SEATS procedure was better in terms of quality than the TRAMO-SEATS approch in this opportunity.

2 Seasonal patterns

Seasonal pattern analysis of each series starts by computing the Seasonal-Irregular ratio (SI ratio thereafter), calculated as the original series divided by the trend-cycle component. After SI-ratio is computed, a time series of each month by years is built in order to analyze the seasonality of each month through time. Figures 2.1 to 2.4 show SI-ratio by month for each variable.

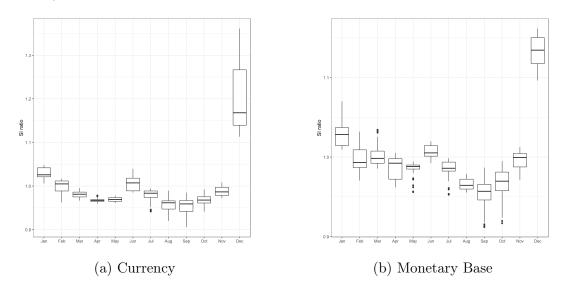


Figure 2.1: SI-Ratio by month

All variables exhibit a seasonal pattern at the end of the year. However, currency, monetary base and M1 show the strongest seasonal pattern in December.

2.1 Seasonality tests

Seasonal tests are used to explore the significance of the seasonal adjustment⁵. It is done for each series in the original form as well as the seasonal adjusted form. The tests used here include seasonal dummies, autocorrelation function analysis at seasonal frequency, no-parametric tests and spectral analysis. In all observed variables the presence of

 $^{^5}$ Seasonal tests are based on EUROSTAT instructions offered in its conceptual framework webpage. You can find it in https://ec.europa.eu/eurostat/sa-elearning/introduction-2.

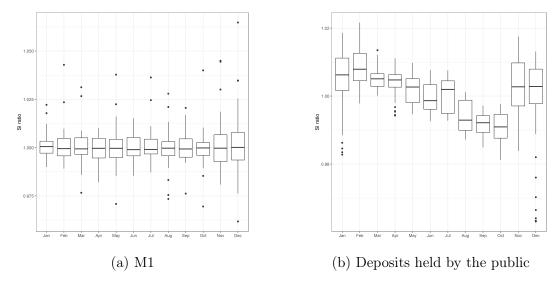


Figure 2.2: SI-Ratio by month

seasonality is identified. Bank consumer loans reject three of the seven original tests of presence of seasonality, but the combined seasonality test identifies seasonality. Tests were also performed for the seasonal adjusted series and they conclude no presence of seasonality. This confirms that the seasonal adjustment procedure was successfully performed.

2.1.1 Residual seasonality test

In addition to previous tests, an F-test was computed looking for Residual Seasonality (RS) for all variables, taking the whole sample and the last three years. There was no evidence of residual seasonality in any case.

2.2 Quality measures

Quality measures of the seasonal adjustment procedure are called the M-statistics, and are summarized by the Q-statistic. All statistics are in the range 0-3. It is acceptable when their value is less than 1. Table 1 shows the quality measures for each variable. For all variables, seasonal adjustment process presets good quality measures.

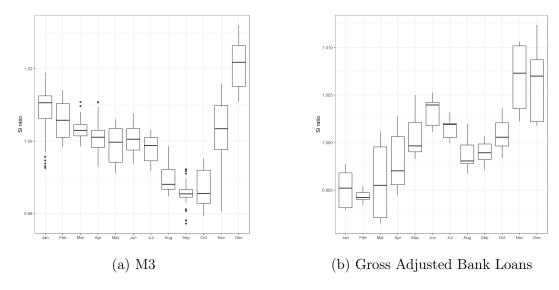


Figure 2.3: SI-Ratio by month

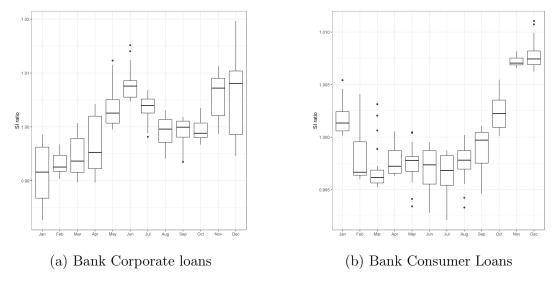


Figure 2.4: SI-Ratio by month

| | Currency | Monetary base | M1 | Deposits | M3 | Loans | Corporate | Consumer |
|-----|----------|---------------|-------|----------|-------|-------|-----------|----------|
| M1 | 0.112 | 0.309 | 0.114 | 0.089 | 0.069 | 0.024 | 0.103 | 0.008 |
| M2 | 0.006 | 0.012 | 0.005 | 0.001 | 0.001 | 0.001 | 0.008 | 0.000 |
| M3 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| M4 | 0.146 | 0.117 | 0.410 | 0.512 | 0.161 | 0.622 | 0.995 | 0.435 |
| M5 | 0.064 | 0.208 | 0.026 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| M6 | 0.129 | 0.142 | 0.221 | 0.196 | 0.200 | 0.341 | 0.174 | 0.602 |
| M7 | 0.146 | 0.260 | 0.140 | 0.543 | 0.346 | 0.496 | 0.937 | 0.512 |
| M8 | 0.398 | 0.619 | 0.408 | 1.246 | 0.848 | 0.990 | 1.242 | 0.720 |
| M9 | 0.143 | 0.199 | 0.126 | 0.293 | 0.227 | 0.448 | 0.821 | 0.508 |
| M10 | 0.205 | 0.353 | 0.245 | 1.020 | 0.591 | 1.734 | 1.831 | 1.035 |
| M11 | 0.161 | 0.276 | 0.229 | 0.948 | 0.514 | 1.690 | 1.810 | 0.985 |
| Q | 0.122 | 0.208 | 0.151 | 0.354 | 0.222 | 0.413 | 0.354 | 0.355 |
| Q-2 | 0.137 | 0.232 | 0.169 | 0.398 | 0.249 | 0.464 | 0.398 | 0.399 |

Table 1: Quality measure statistics

2.3 Treatment of Covid-19-crisis effects on data

The COVID-19 outbreak has had severe impact on economic time series. In order to treat these changes, the European Statistical Office (EUROSTAT) published a methodological note about it ⁶. This note advices to treat the Covid-19 shock as an outlier, taking into account that the type of outlier should depends on the evolution of the time series. We test for the presence of outliers, distinguishing between four types, additive outlier (AO), level shift (LS), temporal change (TC) or seasonal outlier (SO). The methodological note suggests that the COVID-19 shock could be all but the later. Using the anomaly and outlier detection function of the software JDemetra+, we checked for these types of outliers in all the eight series. The results are presented in Figures 2.5 and 2.5. The outlieres identified in 2020 are incorporated as exogenous variables for the model estimation. Remaining outliers could be included automatically during the seasonal adjustment process. Using this approach gives us a significant quality improvement in comparison to not adjustment at all.

 $^{^6}$ EUROSTAT (2020). Methodological note: Guidance on Treatment of Covid-19-crisis Effects on Data.

| | Period | Value | StdErr | TStat |
|----|---------|------------|----------|---------|
| TC | 11-2011 | 1268,5920 | 230,3687 | 5,5068 |
| TC | 4-2013 | -1188,1247 | 237,1625 | -5,0097 |
| TC | 9-2015 | 2217,5584 | 237,1788 | 9,3497 |
| AO | 6-2016 | 990,3528 | 199,8444 | 4,9556 |
| LS | 12-2016 | -1584,6751 | 256,8347 | -6,1700 |
| TC | 2-2017 | -1692,3029 | 228,6118 | -7,4025 |
| LS | 10-2017 | -1144,6571 | 255,6677 | -4,4771 |
| TC | 11-2018 | -1855,8664 | 232,2464 | -7,9909 |
| LS | 3-2020 | 3387,0074 | 361,0125 | 9,3820 |
| LS | 4-2020 | 5310,0558 | 365,9335 | 14,5110 |
| LS | 5-2020 | 2023,4635 | 363,9940 | 5,5591 |
| AO | 9-2020 | 1754,7855 | 380,8259 | 4,6078 |

(a) Efectivo

| | Period | Value | StdErr | TStat |
|----|---------|------------|----------|----------|
| AO | 8-2006 | 2459,9613 | 468,9450 | 5,2457 |
| TC | 9-2008 | 2719,3831 | 500,1806 | 5,4368 |
| AO | 2-2011 | 1870,5641 | 468,6036 | 3,9918 |
| TC | 8-2012 | -2358,9269 | 500,7743 | -4,7106 |
| AO | 10-2012 | 2020,7603 | 485,1361 | 4,1653 |
| AO | 12-2012 | 2746,6799 | 493,5784 | 5,5648 |
| LS | 10-2013 | 2854,3506 | 442,3597 | 6,4526 |
| AO | 12-2013 | -2160,0009 | 483,3592 | -4,4687 |
| TC | 4-2015 | 2237,5214 | 519,7252 | 4,3052 |
| LS | 9-2015 | 4938,2182 | 465,0340 | 10,6190 |
| AO | 10-2015 | 4220,9950 | 482,4885 | 8,7484 |
| LS | 6-2016 | -5034,3102 | 441,3501 | -11,4066 |
| AO | 11-2016 | -1832,6302 | 485,8896 | -3,7717 |
| LS | 1-2017 | -5082,6275 | 462,0322 | -11,0006 |
| AO | 3-2017 | 4429,5432 | 489,6222 | 9,0469 |
| LS | 2-2018 | -2765,7870 | 469,7054 | -5,8883 |
| AO | 3-2018 | 3430,8362 | 506,1352 | 6,7785 |
| AO | 8-2018 | 2022,8866 | 477,7692 | 4,2340 |
| AO | 12-2018 | 5122,4852 | 546,1521 | 9,3792 |
| TC | 5-2019 | 3094,3524 | 557,7158 | 5,5483 |
| LS | 10-2019 | 4591,5677 | 529,2929 | 8,6749 |
| AO | 12-2019 | 3291,6084 | 597,6997 | 5,5071 |
| LS | 3-2020 | 5197,6129 | 542,1573 | 9,5869 |
| AO | 4-2020 | 8006,6784 | 564,1377 | 14,1928 |

(c) Base monetaria

| | Period | Value | StdErr | TStat |
|----|---------|------------|-----------|---------|
| LS | 3-2007 | 7730,3438 | 1023,8358 | 7,5504 |
| AO | 8-2007 | -4899,8301 | 866,6463 | -5,6538 |
| AO | 4-2008 | 3434,3683 | 869,3688 | 3,9504 |
| AO | 7-2012 | -4747,3888 | 866,1772 | -5,4809 |
| TC | 2-2014 | 3750,3151 | 944,2151 | 3,9719 |
| AO | 10-2015 | 4210,4439 | 866,6842 | 4,8581 |
| AO | 12-2017 | 6607,7935 | 936,9836 | 7,0522 |
| LS | 4-2018 | -5775,3294 | 1067,0848 | -5,4122 |
| AO | 12-2018 | 7853,9202 | 961,2528 | 8,1705 |
| LS | 9-2019 | 5153,5105 | 1087,5873 | 4,7385 |
| LS | 3-2020 | 24550,9440 | 1276,7807 | 19,2288 |
| LS | 4-2020 | 11431,7212 | 1403,0613 | 8,1477 |
| TC | 5-2020 | 4689,2709 | 1206,2008 | 3,8876 |

(e) M3

Period Value StdErr TStat 11-2005 1403,1037 322,3043 4,3534 7-2007 -1652,9802 340,0893 -4,8604 9-2007 2026,7144 340,1670 5,9580 11-2011 1415,1142 329,0392 4,3007 1-2012 -1739,9296 393,0205 -4,4271 5-2012 1586,0594 295,7564 5,3627 1-2014 1881,8047 364,8641 5,1575 6-2014 -1499,9884 352,5833 -4,2543 1-2015 2185,6528 308,0182 7,0959 5-2016 -3070,7556 356,8685 -8,6047 2-2017 2197,6037 296,7554 7,4054 12-2017 2391,6145 394,9789 6,0550 5-2018 -1818,1711 368,0035 -4,9406 12-2018 2746,0161 409,7057 6,7024 4-2019 2194,3587 341,6563 6,4227 3-2020 17350,5201 522,5761 33,2019 4-2020 4262,1623 558,4592 7,6320 7-2020 -2758,9045 559,3505 -4,9323

(b) M1

| | Period | Value | StdErr | TStat |
|----|---------|------------|-----------|---------|
| LS | 3-2007 | 6538,7841 | 1204,7647 | 5,4274 |
| AO | 12-2012 | 4943,2235 | 1065,1260 | 4,6410 |
| TC | 12-2017 | 7043,4980 | 1193,6386 | 5,9009 |
| AO | 12-2018 | 6834,1018 | 1128,8991 | 6,0538 |
| LS | 3-2020 | 22227,8930 | 1517,9267 | 14,6436 |
| TC | 4-2020 | 8042,9660 | 1432,6108 | 5,6142 |

(d) Total deposits held by the public

Figure 2.5: Outlier identification: Monetary aggregates

| | Period | Value | StdErr | TStat |
|----|---------|------------|-----------|---------|
| LS | 10-2016 | -4221,1119 | 921,0950 | -4,5827 |
| AO | 4-2019 | -2469,5164 | 636,1837 | -3,8818 |
| TC | 12-2019 | -4403,7712 | 881,7659 | -4,9943 |
| LS | 3-2020 | 5183,8545 | 1011,3490 | 5,1257 |
| TC | 4-2020 | 3805,3934 | 918,9144 | 4,1412 |

| | Period | Value | StdErr | TStat |
|----|---------|------------|----------|---------|
| LS | 8-2015 | 3967,8737 | 874,0558 | 4,5396 |
| TC | 12-2019 | -4061,7360 | 842,4751 | -4,8212 |
| LS | 3-2020 | 5457,1127 | 992,9820 | 5,4957 |
| TC | 4-2020 | 5752,8744 | 878,5695 | 6,5480 |

(b) Corporate loans

(a) Adjusted Gross Loans

| | Period | Value | StdErr | TStat |
|----|---------|------------|----------|----------|
| TC | 10-2007 | 808,4549 | 168,7233 | 4,7916 |
| AO | 11-2015 | -672,7767 | 129,9862 | -5,1758 |
| LS | 5-2019 | 1552,3489 | 214,8728 | 7,2245 |
| LS | 10-2019 | 1025,0896 | 213,1826 | 4,8085 |
| TC | 2-2020 | 1142,4200 | 203,8662 | 5,6038 |
| LS | 4-2020 | -3395,0307 | 254,0417 | -13,3641 |
| LS | 5-2020 | -2441,3413 | 255,8000 | -9,5439 |
| LS | 6-2020 | -1085,0232 | 242,1908 | -4,4800 |
| LS | 7-2020 | -1636,6662 | 237,1383 | -6,9017 |
| TC | 8-2020 | -1132,8328 | 216,9661 | -5,2212 |

(c) Consumer loans

Figure 2.6: Outlier identification: Loans

References

Caporello, G., Maravall, A., and Sánchez, F. J. (2001). Program TSW Reference Manual.

Gómez, V. and Maravall, A. (1998). Seasonal Adjustment and Signal Extraction in Economic Time Series.

Appendix A Level and Growth figures

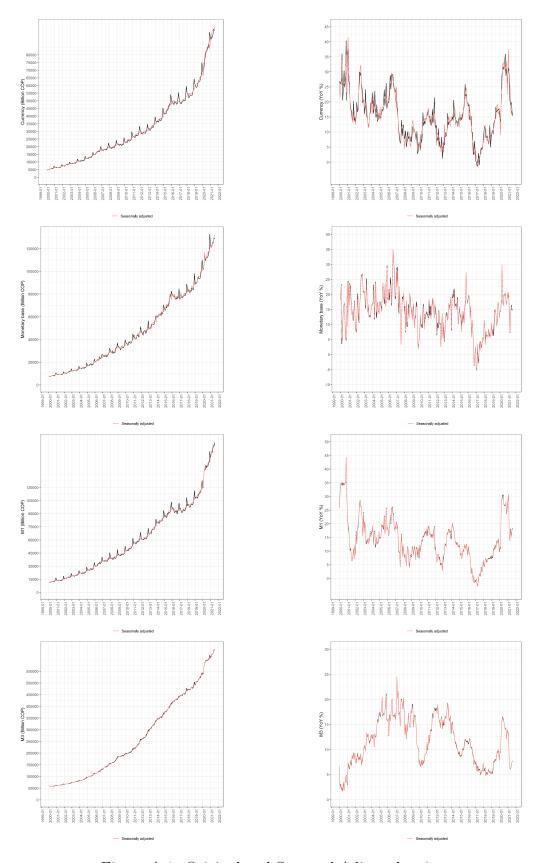


Figure A.1: Original and Seasonal Adjusted series

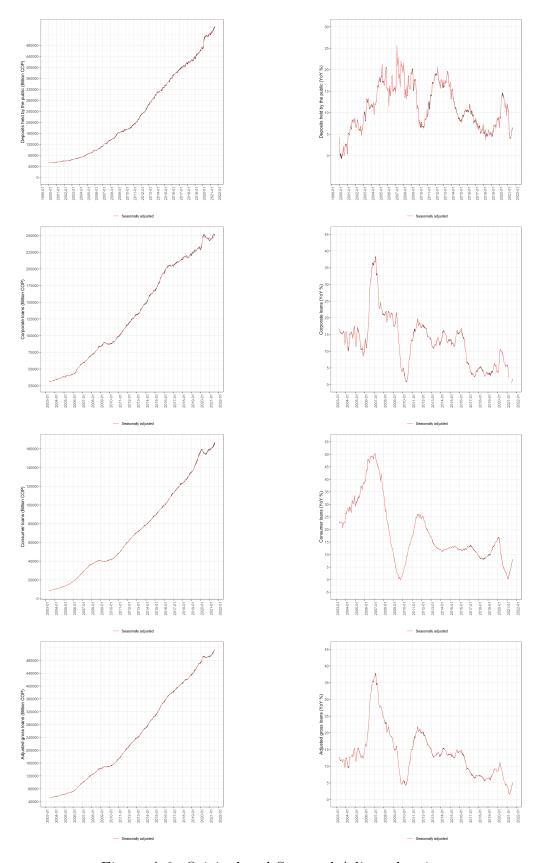


Figure A.2: Original and Seasonal Adjusted series

Appendix B Parameters

Following figures present obtained parameters and model specification for each seasonal adjusted variable analyzed in this document. These parameters should not be used in the seasonal adjustment processes for variables not included here. This fact is because the parameters and specification is unique for each variable and span period analyzed. According with a partial concurrent adjustment, we only reestimate parameters every October. Each month we retest looking for new outliers.

| Variable: | | | Currency |
|--------------------|---------------------|----------------|--------------------------|
| Estimation su | ımmary | | |
| Estimation span | n: | [198 | 4M1 - 2021M8 |
| Number of Obse | ervations: | | 452 |
| Transformation | s: | | Logarithm |
| Corrections: | | | Leap year |
| Working/tradin | g days: | Trading d | ay effects (6 variables) |
| Outliers: | | 6 o | utliers detected |
| Other: | | Eas | ter [15] detected |
| Final model | | | |
| $Likelihood\ stat$ | istics | | |
| Effective observ | vations: | | 440 |
| Number of Pare | ameters: | | 17 |
| Loglike lihood: | | | -991.46 |
| AICC: | | | 5494 |
| BIC: | | | -7.21 |
| ARIMA model | l | | |
| Specification: | | ARI | MA(2,1,0)(0,1,1) |
| | Coefficients | $T	ext{-}Stat$ | P- $value$ |
| Phi(1) | 0.2681 | 5.51 | 0.0000 |
| Phi(2) | 0.1966 | 4.03 | 0.0001 |
| BTheta(1) | BTheta(1) -0.8250 | | 0.0000 |
| $Regression\ mo$ | del | | |
| Mean: | | | |
| | Coefficients | $T	ext{-}Stat$ | P- $value$ |
| mu | -0.0004 | -2.69 | 0.0075 |
| Trading days: | | | |
| | Coefficients | $T	ext{-}Stat$ | P- $value$ |
| Monday | -0.0044 | -2.96 | 0.0033 |
| Tuesday | -0.0061 | -3.44 | 0.0006 |
| Wednesday | 0.0193 | 10.71 | 0.0000 |
| Thursday | -0.0029 | -1.70 | 0.0898 |
| Friday | -0.0004 | -0.25 | 0.8022 |
| Saturday | 0.0001 | 0.04 | 0.9695 |
| Easter | 0.0243 | 4.52 | 0.0000 |
| Outliers: | | | |
| | Coefficients | $T	ext{-}Stat$ | P- $value$ |
| LS(2020M03) | 0.0770 | 3.19 | 0.0015 |
| LS(2020M04) | 0.0392 | 1.57 | 0.1163 |
| LS(2020M05) | 0.0610 | 2.53 | 0.0119 |
| AO(2020M09) | 0.0131 | 0.54 | 0.5891 |
| SO(1986M12) | 0.1259 | 8.89 | 0.0000 |
| SO(2000M12) | 0.0899 | 8.70 | 0.0000 |
| SO(1992M12) | 0.0611 | 5.60 | 0.0000 |
| SO(1985M02) | -0.0731 | -4.05 | 0.0001 |
| AO(1994M11) | 0.0797 | 4.27 | 0.0000 |
| AO(1995M11) | 0.0781 | 14 .19 | 0.0000 |

Table B.1: Parameters: Currency

| Variable: | | M1 | | |
|--------------------------|---------------------|---------------------|----------------------------|--|
| Estimation s | \overline{ummary} | | | |
| Estimation spa | n: | [198 | 84M1 - 2021M8 | |
| Number of Obs | ervations: | - | 452 | |
| Transformation | is: | | Logarithm | |
| Corrections: | | No | | |
| $Working/trading\ days:$ | | | No | |
| Outliers: | | 3 pre-speci | fied / 5 outliers detected | |
| Other: | | | No | |
| Final model | | | | |
| Likelihood star | tistics | | | |
| Effective observ | vations: | | 439 | |
| Number of Par | rameters: | | 11 | |
| Loglike lihood: | | | 1076.56 | |
| AICC: | | | 6052 | |
| BIC: | BIC: | | 7.72 | |
| $ARIMA \ model$ | | | | |
| Specification: | | ARIMA(3,1,0)(0,1,1) | | |
| | Coefficients | T- $Stat$ | P- $value$ | |
| Phi(1) | 0.2619 | 5.37 | 0.0000 | |
| Phi(2) | 0.0460 | 0.91 | 0.3634 | |
| Phi(3) | -0.1236 | -2.53 | 0.0117 | |
| BTheta(1) | -0.8286 | -27.74 | 0.0000 | |
| Regression mo | odel | | | |
| Mean: | | | | |
| | Coefficients | T-Stat | P-value | |
| mu | -0.0004 | -2.74 | 0.0064 | |
| Outliers: | a | T. C | D | |
| | Coefficients | | P-value | |
| LS(2020M03) | 0.1465 | 7.56 | 0.0000 | |
| LS(2020M04) | 0.0309 | 1.58 | 0.1137 | |
| LS(2020M07) | -0.0190 | -0.99 | 0.3204 | |
| LS(1999M12) | 0.0992 | 5.45 | 0.0000 | |
| SO(1995M12) | -0.0585 | -7.02 | 0.0000 | |
| LS(1992M4) | 0.0816 | 4.54 | 0.0000 | |
| SO(2011M12) | 0.0493 | 6.03 | 0.0000 | |
| SO(2002M12) | 0.0352 | 4.18 | 0.0000 | |

Table B.2: Parameters: M1

| Variable: | | | M3 | |
|--------------------|--------------|---------------------|-----------------|--|
| Estimation su | ummary | | | |
| Estimation spar | n: | [1984M1] | -2021M8] | |
| Number of Obse | ervations: | - | 452 | |
| Transformation | s: | Log | garithm | |
| Corrections: | | | No | |
| Working/tradin | $g \ days$: | | No | |
| Outliers: | | 3 pre- | -specified | |
| Other: | | | No | |
| Final model | | | | |
| $Likelihood\ stat$ | istics | | | |
| Effective observ | vations: | 439 | | |
| Number of Pare | ameters: | 6 | | |
| Log like lihood: | | 1284 | | |
| AICC: | | 6809 | | |
| BICC: | | -8.82 | | |
| $ARIMA \ mode$ | l | | | |
| Specification: | | ARIMA(0,2,1)(0,1,1) | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | |
| Theta(1) | -0.9191 | -47.00 | 0.0000 | |
| BTheta(1) | -0.8225 | -28.61 | 0.0000 | |
| Outliers: | | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | |
| LS(2020M03) | 0.0476 | 4.08 | 0.0001 | |
| LS(2020M04) | 0.0235 | 2.01 | 0.0448 | |
| TC(2020M05) | 0.0052 | 0.49 | 0.6227 | |

Table B.3: Parameters: M3

| Variable: | | | Monetary Base | | |
|--------------------------------|---------------------|---------------------|-------------------------------|--|--|
| Estimation su | \overline{ummary} | | | | |
| Estimation spar | | [1 | 1984M1 - 2021M8 | | |
| Number of Obse | ervations: | | 452 | | |
| Transformation | s: | Logarithm | | | |
| Corrections: | | | No | | |
| Working/tradin | $g \ days$: | | No | | |
| Outliers: | | 2 pre-spe | ecified / 5 outliers detected | | |
| Other: | | 1 | No Easter detected | | |
| Final model | | | | | |
| $Likelihood\ stat$ | istics | | | | |
| $\it Effective\ observations:$ | | | 441 | | |
| Number of Parameters: | | | 14 | | |
| Loglike lihood: | | 860 | | | |
| AICC: | | 6228 | | | |
| BICC: | BICC: | | -6.74 | | |
| ARIMA model | l | | | | |
| Specification: | | ARIMA(1,1,1)(0,1,1) | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | | |
| Phi(1) | -0.2372 | -1.88 | 0.0605 | | |
| Theta(1) | -0.5504 | -5.07 | 0.0000 | | |
| BTheta(1) | -0.8309 | -29.75 | 0.0000 | | |
| $Regression \ mo$ | del | | | | |
| Outliers: | | | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | | |
| \ | LS(2020M03) 0.0450 | | 0.1409 | | |
| AO(2020M04) | 0.0770 | 2.89 | 0.0041 | | |
| AO(1999M12) | 0.1367 | 5.41 0.0000 | | | |
| TC(1998M12) | -0.1259 | -4.26 | 0.0000 | | |
| LS(1998M10) | -0.1223 | -4.19 | 0.0000 | | |
| LS(1991M09) | 0.3151 | 5.85 | 0.0000 | | |
| TC(1991M09) | -0.2330 | -4.29 | 0.0000 | | |

Table B.4: Parameters: Monetary Base

| Variable: | | Deposits held by the public | | | |
|--|------------------|---|------------|--|--|
| Estimation su | ımmary | | | | |
| Estimation span: | | [1984M1 - 2021M8] | | | |
| Number of Observations: | | 432 | | | |
| Transformation | Transformations: | | Logarithm | | |
| Corrections: | | No | | | |
| $Working/trading\ days:$ | | No | | | |
| Outliers: | | 2 pre-specified $/$ 3 outliers detected | | | |
| Other: | ther: | | No | | |
| Final model | | | | | |
| $Likelihood\ stat$ | istics | | | | |
| Effective observ | | | 439 | | |
| $Number\ of\ Parameters:$ | | 7 | | | |
| Loglike lihood: | | 1258 | | | |
| AICC: | | 6772 | | | |
| BICC: | | -8.65 | | | |
| ARIMA mode | l | | | | |
| Specification: | | ARIMA(0,2,2)(0,1,1) | | | |
| | Coefficients | $T	ext{-}Stat$ | P- $value$ | | |
| Theta(1) | -1.1480 | -24.29 | 0.0000 | | |
| Theta(2) | 0.2523 | 5.36 | 0.0000 | | |
| BTheta(1) | -0.8069 | -27.37 | 0.0000 | | |
| $Regression \ mo$ | del | | | | |
| Outliers: | | | | | |
| T 0 (2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 | Coefficients | T- $Stat$ | P- $value$ | | |
| LS(2020M03) | 0.0504 | 4.05 | 0.0001 | | |
| TC(2020M04) | 0.0161 | 1.40 | 0.1623 | | |
| TC(1991M07) | -0.0546 | -5.14 | 0.0000 | | |
| LS(2007M03) | 0.0510 | 4.50 | 0.0000 | | |
| SO(1990M12) | -0.0310 | -5.80 | 0.0000 | | |

Table B.5: Parameters: Deposits in the Financial System

| Variable: | | Bank Corporate Loans | | | |
|--------------------------|---------------------------|---------------------------------------|-----------------|--|--|
| Estimation su | \overline{ummary} | | | | |
| Estimation span: | | [2002M5 - 2021M8] | | | |
| Number of Observations: | | 232 | | | |
| Transformations: | | Logarithm | | | |
| Corrections: | | No | | | |
| $Working/trading\ days:$ | | No | | | |
| Outliers: | | No | | | |
| Other: | | 2 pre-specified / 2 outliers detected | | | |
| Final model | | | | | |
| $Likelihood\ stat$ | istics | | | | |
| Effective observ | vations: | 218 | | | |
| Number of Pare | $Number\ of\ Parameters:$ | | 4 | | |
| Loglike lihood: | | 1728 | | | |
| AICC: | | 3471 | | | |
| BICC: | | 13.89 | | | |
| ARIMA model | Į. | | | | |
| Specification: | | ARIMA(1,1,0)(0,1,1) | | | |
| | Coefficients | | $P	ext{-}value$ | | |
| Phi(1) | -0.3549 | -5.28 | 0.0000 | | |
| BTheta(1) | -0.7303 | -13.08 | 0.0000 | | |
| $Regression \ model$ | | | | | |
| Outliers: | | | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | | |
| LS(2020M03) | 5516.5 | 5.76 | 0.0000 | | |
| TC(2020M04) | 5766.8 | 6.83 | 0.0000 | | |
| AO(2019M11) | 2897.2 | 5.11 | 0.0000 | | |
| LS(2015M08) | 3675.6 | 4.28 | 0.0000 | | |

Table B.6: Parameters: Bank Corporate Loans

| Variable: | | Bank Consumer Loans | | |
|--------------------|--------------|---------------------------------------|-------------------|--|
| Estimation su | ummary | | | |
| Estimation span: | | | [2002M5 - 2021M8] | |
| Number of Obs | ervations: | | 232 | |
| Transformations: | | Logarithm | | |
| Corrections: | | No | | |
| Working/tradin | g days: | Trading days (6 variables) | | |
| Outliers: | | 6 pre-specified / 3 outliers detected | | |
| Other: | | No | | |
| Final model | | | | |
| $Likelihood\ stat$ | istics | | | |
| Effective observ | vations: | 230 | | |
| Number of Pare | ameters: | | 12 | |
| Loglike lihood: | · · | | -1421 | |
| AICC: | | | 2889 | |
| BICC: | | | 11.37 | |
| $ARIMA \ mode$ | l | | | |
| Specification: | | ARIMA(0,2,1)(0,1,1) | | |
| | Coefficients | $T	ext{-}Stat$ | P- $value$ | |
| Theta(1) | -0.4700 | -7.13 | 0.0000 | |
| BTheta(1) | -0.7043 | -11.81 | 0.0000 | |
| $Regression\ mo$ | del | | | |
| Trading days: | | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | |
| Monday | -57.11 | -4.23 | 0.0000 | |
| Tuesday | -91.56 | -5.71 | 0.0027 | |
| Wednesday | 78.31 | 4.94 | 0.0005 | |
| Thursday | - 5.86 | -0.38 | 0.7033 | |
| Friday | 101.80 | 6.65 | 0.0000 | |
| Saturday | -26.29 | -1.72 | 0.0878 | |
| Outliers: | | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | |
| TC(2020M02) | 1073.87 | 5.30 | 0.0000 | |
| LS(2020M04) | -3384.26 | -14.45 | 0.0000 | |
| LS(2020M05) | -2451.51 | -9.86 | 0.0000 | |
| LS(2020M06) | -1285.06 | -5.33 | 0.0000 | |
| LS(2020M07) | -1731.63 | -7.22 | 0.0000 | |
| TC(2020M08) | - 923.92 | -4.57 | 0.0000 | |
| LS(2019M05) | 1803.89 | 8.67 | 0.0000 | |
| SO(2017M11) | - 565.62 | -5.98 | 0.0000 | |
| LS(2019M10) | 1149.96 | 5.53 | 0.0000 | |
| TC(2007M10) | 877.91 | 5.24 | 0.0000 | |
| AO(2015M11) | - 621.35 | -4.94 | 0.0000 | |

Table B.7: Parameters: Consumer loans

| Variable: | | Adjusted Gross Bank Loans | | |
|----------------------------|---------------------|---|-----------------|--|
| Estimation su | \overline{ummary} | | | |
| Estimation span: | | [2002M5 - 2021M8] | | |
| Number of Observations: | | 232 | | |
| Transformation | s: | Logarithm | | |
| Corrections: | | No | | |
| $Working/trading\ days:$ | | No | | |
| Outliers: | | 2 pre-specified $/$ 3 outliers detected | | |
| Other: | | No | | |
| Final model | | | | |
| $Likelihood\ stat$ | istics | | | |
| $Effective\ observations:$ | | 219 | | |
| Number of Parameters: | | 7 | | |
| Loglike lihood: | | -1741 | | |
| AICC: | | 3498 | | |
| BICC: | | 14.12 | | |
| $ARIMA \ model$ | | | | |
| Specification: | | ARIMA(0,2,1)(0,1,1) | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | |
| Theta(1) | -0.6563 | -11.97 | 0.0000 | |
| BTheta(1) | -0.6963 | -11.90 | 0.0000 | |
| $Regression \ model$ | | | | |
| Outliers: | | | | |
| | Coefficients | $T	ext{-}Stat$ | $P	ext{-}value$ | |
| LS(2020M03) | 5467.13 | 5.48 | 0.0000 | |
| TC(2020M04) | 6951.89 | 6.79 | 0.0000 | |
| TC(2019M12) | -4246.01 | -4.85 | 0.0000 | |
| (| -4246.35 | -4.63 | 0.0000 | |
| SO(2019M04) | 2431.97 | 4.20 | 0.0000 | |

Table B.8: Parameters: Adjusted Gross Bank Loans