

Time series properties of US reference rates 2016- 2023

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2024-06-11

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1 Introduction

How monetary policy impacts volatility of rates in the market for repurchase agreements also reveals how the Federal Reserve preference for volatility as it manages the policy rate, the Federal Funds rate (FFR) with the target rates specified by the FOMC. The Fed's open market operations through repurchase transactions. maintain the federal funds (fed funds) rate within the FOMC's target range. One puzzle the the survival of the Federal Reserve Bank's (Fed) FFR management of of the Federal Funds rate survives the volatility of short rates.

Events after the Great Financial Crisis (GFC), the excess liquidity created by quantitative easing, the spikes in repo and the FFR in 2019, the March 2020 dash for cash show how the adjustment of reserves

through repurchase markets and the arbitrage opportunities between repo and the price of reserves affect credit and the economy.

The daily \$4 trillion funding market provides liquidity to primary dealers, hedge funds, money market funds, government-sponsored enterprise (GSEs), banks, and private investors. Bank reserves and deposits are regularly swapped for Treasuries and other securities, which are then swapped for repurchase agreements (repos) used to fund loans, obtain leverage, and many other functions. The Federal Reserve also adjusts reserves in the tri party repurchase market, both as a lender and borrower. It has also established facilities for dealers and investors, the Standard Repurchase Facility (SRF) to fund dealers. And the Overnight Reverse Repurchase Facility (O/N RRP) for lenders to invest excess liquidity. Identifying the behavior and relationships among these reference rates, policy and money market rates, is important to understanding the monetary system.

The repurchase funding markets are: - triparty TGCR — the major dealer funding market - GCF — the interdealer repo market - bilateral BGCR — the dealer-to-customer repo market

The tri-party general collateral market (with money market rate TGCR), is repo's primary funding market. In tri-party repo, most players are cash lenders or borrowers. For example, primary dealers required to intermediate US Treasury issuance to their customers finance these purchases from their inventory or by borrowing from the Fed in the triparty market. To manage the federal funds rate within its target range, the Federal Reserve responds to volatility in the federal funds rate by adjusting reserves through repo and reverse repo operations in the triparty market. The Fed is the only major participant to engage in both tri-party repo borrowing and lending. Participants obtain cash at the cheapest rates primarily from MMFs (money market funds) in tri-party repo, then lend at a spread in other repo markets. Primary dealers sell securities to the customers in the more lucrative OTC broad general collateral market, (rate BGCR). The Secured Overnight Financing Rate (SOFR) is the Fed's broadest measure of repo rates

The Federal Funds rate is the Fed's policy rate, the rate banks exchange funds in the interbank market. The administered rates for setting policy, interest on reserves (IORB) and the overnight reverse repo rate are important tools for managing the FFR. The FFR, the administered rates, and money market rates have similar qualities of short rates: - All rates track and cluster around the FFR (measured by the effective Federal Funds rate (EFFR)) - Money market rates quickly respond to changes in the FFR and administrative rates, the IORB and the ON/RRP - The central tendency of all rates is their tight (low variance) clustering around their medians - Their volatility changes over time, conditional heteroskedasticity - Rates highly skewed, - Distributions fat tailed with the presence of extreme outliers - Pronounced autocorrelation patterns - Arbitrage opportunities exist to invest in repo when SOFR exceed IORB, the interest banks can receive on deposits with the Fed

There are several ways the level of reserves in the banking system can change: 1) because funds are transferred between reserves and non-reserve accounts at the Federal 2) changes in the US Treasury account at the Fed 3) The Federal Reserve responds to volatility in the federal funds market by adjusting the reserve supply to keep the federal funds rate within its target range through these repo and reverse repo operations each day

This paper focuses on action (3). By trading securities with banks and other counterparties, Federal Reserve purchases or sales of assets from banks change the size of the Federal Reserve balance sheet. A repurchase transaction or repo is a loan secured by collateral subject to an agreement to resell the securities at a later date. The borrower issues a cash equivalent liability to the lender. In a reverse repo an entity lends cash against secured collateral. The Federal Reserve manages the FFR with temporary borrowing, repurchase agreements and lending, reverse repurchase agreements. In a repo transaction, the Desk purchases securities from a counterparty. The transaction temporarily increases the supply of reserve balances in the banking system and lower the FFR. In a reverse repo transaction, the Desk sells securities to a counterparty subject to an agreement to repurchase the securities at a later date. Reverse repo transactions temporarily reduce the supply of reserve balances in the banking system and raise the FFR.

This paper describes the dynamics of these rates and proposes a model of volatility joint with monetary policy. Comparing different policy regimes, we hope to elucidate the Fed's preferences for volatility in managing the FFR within ranges set by the FOMC. How that volatility may vary under different

monetary policy regimes may reveal the Fed's preferences for offsetting volatility in managing the FFR with the FOMC targets.

Section 1 reviews monetary policy over the seven year period, 2016-2023 and narrates FOMC rate changes, monetary regimes, and events in order to define monetary shocks. Section 2 reviews the time series properties of daily policy and money market rates, and transactions and reserves held at the Federal Reserve from 3/4/2016-12/14/2023. Section 3 describes rate behavior during different policy episodes. Section 4 discusses methodology. Section 5 Results. Section 5 Conclusions. Sections 4-6 are in progress.

Hamilton (1996) estimates the conditional mean and the conditional variance of the daily Federal Funds rate (FFR) in an adaption of Nelson's (1991) EGARCH model. He attributes the greater effect an open-market purchase to smooth out small fluctuations in the FFR, rather than interday arbitrage. Adding reserves through an overnight repurchase agreement lowers the federal funds rate by inducing movement along a schedule that represents lending banks' liquidity benefit from holding excess reserves. He identifies important day effect, the last day of the quarter or the last day of the year, in producing the extreme volatility, large outliers of the FFR.

Piazzesi (2005) constructs a continuous-time model of the joint distribution of bond yields and the FOMC interest rate target for the FFR. With high-frequency data in a linear-quadratic jump-diffusion model, she provides information about the exact timing of FOMC meetings. This information can improve bond pricing and ability to identify monetary policy shocks.

Both Federal Reserve and financial markets watch and depend on bond yields. Yield-based information may underlie the FOMC's policy decisions and describes Fed policy better than Taylor rules. The Fed's estimated policy rule reacts to information in the yield curve, especially yields with two year maturities, implying the Fed responds to some medium-run forecast of the economy. The short informational lag before Fed's policy decision, information available right before the FOMC meeting start provides a recursive identification scheme that turns the target forecast from right before the Federal Open Market Committee (FOMC) meeting into a high-frequency policy rule and the associated forecast errors into policy shocks.

Decisions about target moves result in a series of target values that looks like a pure jump process. Estimates reveals increased volatility of interest rates at all maturities in both FOMC meeting days and releases of key macroeconomic data. Macro news releases change the conditional distribution of a future Fed move.

(Andersen, Benzoni, Lund, 2004) model the U.S. short-term interest rate 3 month Tbill with a three-factor jump-diffusion model, a time-varying mean reversion factor, a stochastic volatility factor, and a jump process. The U.S. short-term interest rate is characterized by complex conditional heteroskedasticity, fat-tailed innovations, and pronounced autocorrelation patterns. Stochastic volatility is critical for a good fit. Benzoni et al identify mean reversion of the short rate around a central tendency. The stochastic mean allows a relatively fast mean-reversion of the short rate around a highly persistent time-varying central tendency process. Jumps are integral to the quality of fit and relieve the stochastic volatility factor from accommodating extreme outlier behavior.

The mean drift may be indicative of slowly evolving inflationary expectations (Gara horiz?), time-variation in the required real interest rate, or both.

Bertolini, Bertola, Prati (), Garaet al () and Benzoni observe these effect of Fed interventions on the volatility in interbank rates * declines in high rate regimes

- * rises end of quarter, end of year

- * falls before holidays, rises day after

- * many rate changes are half percent or more (annualized)

- * outliers

- * Volatility persistent like Hamilton, end of quarter, end of year, before and after holidays, large rate changes.

Bertolini, Bertola, Prati (2004) model of FFR volatility seeks to isolate Fed preferences for offsetting volatility in the FFR market. This search was motivated by the puzzle that the high frequency patterns of FFR volatility survives Fed's attempt to manage the FFR within the FOMC target range.

Overnight wholesale money market rates both track the FFR and quickly revert to changes in the unsecured federal funds rate (FFR) or administered rates.

Gara Afonso, Kyungmin Kim, Antoine Martin, Ed Nosal, Simon Potter, and Sam Schulhofer-Wohl derive a function of reserve demand that describes the price at which banks are willing to trade reserves as a function of the total amount of reserves in the banking system. The function measures banks' demand for liquidity as a function of aggregate reserves and the FFR under the Fed's policy of ample supply of reserves (2020). The FFR is price at which banks are willing to borrow and lend reserve balances. The Banks' reserve demand sensitivity to shocks to reserves is greater when reserves are scarce.

Policy changes shift the curve up and down by moving its lower bound. Increases (decreases) in the (FFR-IORB) IORB rate shift the demand curve down (up by changing the banks' opportunity cost of lending in the federal funds market. Low frequency horizontal shifts in the demand function reflect sensitivity of rates to shocks to reserves

The Romer and Romer (2023) narrative approach to macroeconomic identification identify significant contractionary and expansionary changes in monetary policy not taken in response to current or prospective developments in real activity. However, this approach would exclude shocks such as policy changes such as QE, LSAP, and forward guidance or events such the spike in repo rates in 2019 or the March 2020 dash for cash. Changes in the Fed funds rate and the administered rates IORB and the reward rate ON RRP are one source of shocks to overnight reference rates (@ref{table:FOMC rate changes 2016-2023})

Jarocinski (2002) Another literature identifies monetary policy shocks from changes of financial asset prices in a narrow time window around Federal Open Market Committee (FOMC) announcements. Prior to the announcement, asset prices reflect the consensus view on the state of the economy and the Fed's expected response to it. Afterwards, asset prices incorporate also any unexpected news conveyed in the announcement. These news could be about the current fed funds rate or its future path, asset purchases, the Fed's view on the state of the economy, etc. They represent different structural shocks that may affect the economy differently.

Estimating the Fed's unconventional policy shocks Javorscinski () estimates the structural shocks that underlie the reactions of financial market to FOMC announcements. While the nature of the shocks is not specified ex ante, ex post the estimated shocks can be naturally labeled as the current fed funds rate policy, an "Odyssean" forward guidance (a commitment to a future course of policy rates), a large scale asset purchase and a "Delphic" forward guidance (a statement about the future course of policy rates understood as a forecast of the appropriate stance of the policy rather than a commitment (Campbell et al., 2012).

Alvarez metrics for kurtosis

2 Overnight reference rates and transactions

Daily weighted average median rates reference rates, policy and money market rates provided by the NY Federal Reserve download program comprise the effective federal funds rate (EFFR) that tracks transactions in the federal funds market, the secured overnight funding rate (SOFR) that captures transactions in overnight wholesale funding markets, and the money market rates - the Tri-Party General Collateral Rate (TGCR) and the broad general collateral rate (BGCR).

Repurchase agreements to borrow or lend securities for cash or reserves take place in the tri-party, GCF repo, and bilateral markets. The TGCR are rates on overnight, specific-counterparty tri-party general collateral repurchase agreement (repo) transactions secured by Treasury securities. Transactions in the tri party market are centrally cleared. The over the counter BGCR rates are the more lucrative rates in which the U.S. central bank primary dealers trade with their customers. The SOFR, a broad measure of the cost of borrowing cash overnight collateralized by Treasury securities replaced LIBOR as a benchmark overnight rate. The SOFR includes all trades in the Broad General Collateral market plus bilateral Treasury repurchase agreement (repo) transactions cleared through the Delivery-versus-Payment (DVP) service offered by the Fixed Income Clearing Corporation (FICC).

2.1 Monetary policy during the sample period 2016-2023

Before the Great Financial Crisis (GFC) of 2008, Federal Reserve policy was conducted by open market operations (OMO), trading a limited central reserves and securities in the interbank Federal Funds market. To address the great financial crisis (GFC), the Fed's large scale asset purchases (LSAPs) from 2008 to 2014 - QE, QE1, QE2, and QE3, funded by US Treasury sale of Treasury bills substituted reserve balances for a large part of its SOMA Treasury holdings. But LSAPs resulted in excess liquidity, swamped with reserves, banks had no need to borrow in the Fed Funds market. From 2010 to late 2019, reserves went through a full expansion-contraction cycle. Again in early 2020, reserves grew from \$8 trillion from 2010 and 2019 to \$19 trillion (2014 and 2021).

To regain control over the FFR after this major increase in liquidity, the Fed experimented with different policies.

October 1, 2008, Congress gave the Fed the power to pay interest on reserves (IORB) to help control the Federal Funds rate. The IORB rate, the interest rate that banks earn from the Fed on the funds deposited in their reserve accounts is the Fed's principal tool for interest rate control. In 2013, to address the post GFC build up of excess liquidity, the Federal Reserve introduced the overnight reverse repurchase facility (ON RRP), the Fed's supplementary tool for interest rate control.

In 2019 the policy regime of ample reserves initiated by the FOMC manages the Fed Funds rate within the target range adopted by the FOMC in 2018. The creation of these administrative rates, the (IORB) and ON RRP created a corridor system defined by FOMC target rates within which Fed manages the FFR. The Fed temporarily intervenes in repurchase (repo) and reverse repo markets to offset high frequency liquidity shocks in order to keep the FFR close to target. Together these administrative rates create a floor system for managing the FFR. IORB is the ceiling and the ON RRP rate the floor. No bank would lend at rates lower than the IORB nor borrow at rates higher than the O/N RRP rate.

The Fed's involvement in repurchase markets

since the 1920s, The Fed used repo transactions to manage the reserves held by commercial banks with the Fed. Repo operations became the Fed's primary means of adjusting bank reserves.

Repurchase and reverse purchase transactions

To offset liquidity shocks, the Fed temporarily intervenes in repurchase (repo) and reverse repo transactions to keep the federal funds rate within the FOMC target range. Repurchase agreements drain reserves from the system and raise the FFR. Reverse repo purchases of assets by the Fed add reserves and lower the FFR.

The reverse repurchase facility Fed opened its RRP (reverse repo) facility in 2013 to absorb the excess liquidity after the GFC that drove the Fed Funds rate below the Fed's target range. The Overnight Reverse Repo Program (ON RRP) allows eligible counterparties to lend excess funds to the Fed through repo transactions, ensuring that repo rates remain close to or above the ON RRP rate. During periods of high reserves, the reverse repo facility takes up reserves when banks no longer want to take on additional reserves and reducing deposit rates and other funding.

The Standing Repo Facility (SRF) The 2019 spike in repo rates followed the Fed reduction its balance sheet build up after quantitative easing (QE). the FFR, and FX swap rates exceeded the Fed's upper target rate. The Fed initiated the Standing Repo Facility (SRF) after scarce bank reserves constrained dealer balance sheets, leading to cash shortage and a segmented repo market. The SRF lets primary dealers and other approved counterparties borrow cash from the Fed, secured against U.S. Treasuries. The Fed transformed the SRF into a permanent facility.

Other changes The central banks continued to change their overall frameworks for controlling short-term interest rates. The FOMC reference rate changes from Libor to SOFR, was one such policy change.

Concorda: from excess cash to excess collateral RRP, the sole shock absorber for excess liquidity April 2021, the Federal Reserve began unwinding measures that enabled its largest monetary expansion on record. During the COVID-19 panic, the Fed allowed banks to absorb vast flows from QE by exempting reserves and Treasuries from its SLR (Supplementary Leverage Ratio). The onset of the

Covid-19 pandemic in early 2020 led to turmoil in various financial markets. Treasury markets faced similar turmoil, as a dash for cash by investors led to liquidity challenges across a variety of markets. Government agencies took action to stabilize financial markets and the economy.

In June 2022, the Federal Reserve started reducing the size of its balance sheet, which had expanded to just under \$9 trillion in response to the COVID-19 pandemic. However, whereas banks' reserves at the Federal Reserve have decreased, the investment of money market funds (MMFs) at the Federal Reserve's overnight reverse repo (ON RRP) facility has continued to increase, reaching \$2.4 trillion in September 2022.

Throughout 2022, the rate for dealers to borrow from cash lenders remained tightly pinned to ON RRP. The Fed's ON RRP thus began to determine rates in tri-party repo. Repo rates must rise above both ON RRP and IORB for banks to fund repo trades with reserves, since they can earn IORB returns on reserves. When the spread between SOFR and IORB widens, financial participants allocate cash to repo trades, supplying liquidity to the most crucial funding market.

Beginning in 2023, the RRP balance was \$2.5 trillion in excess liquidity. However, returns on large U.S. Treasury issuance in June 2023 exceeded the ON RRP rate. The RRP balance peaked as the primary RRP users, MMFs, bought Treasuries. RRP balance plunged below \$800 billion in December 2023 (currently \$439.81 billion, 5/31/2024).

Once the surplus of cash in the Fed's RRP facility dries up, the stability of the triparty repo market will once again be tested. The Fed's QT (quantitative tightening) and the U.S. Treasury's giant debt issuance will continue to pull funding away from repo, perhaps causing a repeat of the September 2019 "repocalypse". Sensing a recurrence, a large number of banks have begun signing up to the Fed's standing repo facility, granting themselves the ability to receive emergency loans and front-run a repo rate spike. If turmoil re-emerges, more monetary theatrics from the Federal Reserve await us, and the triparty repo market will be front and center.

2.2 FOMC rates changes, monetary regimes, and events over the seven year period, 2016-2023

Candidate shocks occurring during the seven year period of our sample 2016-2023 (Table @ref{table_fomc}) include FOMC rate and administered rate changes, different policy experiments, events such as the March 2020 dash for cash, and macroeconomic announcements. Changes in the Fed funds rate and the administered rates IORB and the reward rate ON RRP are one source of shocks to overnight reference rates (@ref{table:FOMC rate changes 2016-2023})

The Romer and Romer (2023) narrative approach to macroeconomic identification incorporate the evidence into a statistical framework. Their criteria that monetary shocks be unrelated to current or prospective real economic activity changes would exclude shocks such as policy changes such as QE, LSAP, and forward guidance or events such the spike in repo rates in 2019 or the March 2020 dash for cash.

The literature beginning Campbell et al. (2012) identifies monetary policy shocks from changes of financial asset prices in a narrow time window around Federal Open Market Committee (FOMC) announcements. The authors distinguish between Odyssean forward guidance, which publicly commits the FOMC to a future action, and Delphic forward guidance, which merely forecasts macroeconomic performance and likely monetary policy actions.

Prior to the announcement, asset prices reflect the consensus view on the state of the economy and the Fed's expected response to it. Afterwards, asset prices incorporate unexpected news conveyed in the announcement. News could be the current fed funds rate or its future path, asset purchases, the Fed's view on the state of the economy. They represent different structural shocks that may affect the economy differently.

Jarocinski (2022) estimates structural shocks underlying the reactions of financial market to FOMC announcements. Not specified ex ante, ex post the estimated shocks can be labeled as the current fed funds rate policy, as 1) an "Odyssean" forward guidance, a commitment to a future course of policy rates such as a large scale asset purchase or 2) a "Delphic" forward guidance, a statement about the future

course of policy rates, a forecast of the appropriate stance of the policy rather than a commitment (Campbell et al., 2012).

His baseline model expresses surprises, high-frequency reactions to FOMC announcements, in near-term fed funds futures, 2 and 10-year Treasury yields and the S&P500 stock index as linear combinations of four Student-t distributed shocks}. These four shocks ex post have natural economic interpretations: 1. the standard monetary policy shock raises the near-term fed funds futures, with a diminishing effect on longer maturities, and depresses stock prices. 2. The (Odyssean) forward guidance shock increases the 2-year Treasury yield the most and depresses the stock prices. 3. The asset purchase shock increases the 10-year Treasury yield the most and plays a large role in some of the most important asset purchase announcements. 4. Delphic forward guidance shock (Campbell et al. 2012) has a similar impact on the yield curve as the Odyssean forward guidance shock, but triggers an increase, rather than a decrease, in the stock prices.

Monika Piazzesi (2005) takes this approach in a continuous-time model of the joint distribution of bond yields and the FOMC interest rate target for the FFR in a linear-quadratic jump-diffusion model. With high-frequency data she provides information about the exact timing of FOMC meetings. The short informational lag before Fed’s policy decision, information available right before the FOMC meeting start provides a recursive identification scheme that turns the target forecast from right before the Federal Open Market Committee (FOMC) meeting into a high-frequency policy rule and the associated forecast errors into policy shocks.

The shocks (Table @ref{table:FOMC rate changes 2016-202}) encompass changes in both policy and administered rates- FFR, IOR, ONRRP (same as changes in RRF?) and classify these changes under episodes). I have included events like US Treasury sales and macro financial shocks like the repo shock in 2019 and the dash for cash event in March 2020. I have included observations of US Treasury debt issuance and events such as the repo apocalypse in 2019 and the dash for cash of March 2020.

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## Warning in notes_with_valid_dates$Date <- notes_with_valid_dates: Coercing LHS
## to a list
```

% latex table generated in R 4.3.2 by xtable 1.8-4 package % Tue Jun 11 22:53:51 2024

3 Time series properties of overnight policy, money market rates, transactions, and reserves held at the Federal Reserve

Overnight money market rates in funding markets share several features. They closely track and cluster around the Fed policy rate, the EFFR. They respond quickly to changes in the EFFR or the administered rates IORB and ON RRP (Figure @ref(fig: 3/4/2016-12/14/2023)). Their medians change over time, their small interquartile range (IQR) indicates that they cluster tightly around their medians. They contain extreme values or outliers, characteristic of fat tailed distributions. Rates are heteroskedastic - volatility as measured by percent change in their medians varies over time.

Repurchase and reverse repurchase funding markets have become a major source of funding for primary dealers, hedge funds, government-sponsored enterprise (GSEs), money market funds (MMFS) and other participants. Primary dealers appointed by the Fed are required to intermediate new US Treasury issues. Primary dealers borrow at cheaper rates from lenders, asset managers in the tri party and the Fed, then lend at a spread in other repo markets. Loans are secured by collateral. They lend at the higher broad General Collateral Rate (BGCRR) to leveraged investors such as hedge funds. The Fed conducts OMO in the tri party market, both borrowing and lending. The Secured Overnight Financing Rate (SOFR), Fed’s broadest measure of repo rates, expresses the average cost of borrowing overnight.

3.1 The history or rates from 3/4/2016-12/14/2023

The rate data from the Federal Reserve Data Download Program, average volume weighted medians, q better measure of central tendency since daily rates have skewed distributions with outliers. The

Interquartile range (IQR), the 75th minus the 25 percentile of the data contains 50 percent of the data. Less influenced by extreme values, the IQR is a measure of variability that describes how tightly rates cluster around their median. The range, the 99th minus the one percentile, some two percent of rates, show the magnitude of the outliers (Table (@ref(tab:Rate characteristics 2016-2023)), the extreme values in rates.

Funding rates track the FFR Median funding rates closely track the the policy rate, the effective Federal funds rate (EFFR) (Table @ref(tab:Sample statistics 2016-2023)). Similar average median rates illustrate the tendency of money market rates and SOFR to cluster around the EFFR. The average median EFFR over the full sample is 157 basis point (bp), the money market rates about 132-134 bp - Tri-Party General Collateral Rate (TGCR), the Broad General Collateral Rate (BGCR) 133 bp, the the Secured Overnight Financing Rate (SOFR), 134 bp. The percentiles of rates reflect the same clustering around the EFFR (Figure @ref (fig:EFFR percentiles of the sample 3/4/2016-12/14/2023)).

Variability: All rates except SOFR cluster tightly around their median (IQR) Small IQRs indicate the FFR and money market rates are tightly clustered around their median values (Figure @ref(fig:EFFR IQR and range of the sample 3/4/2016-12/14/2023)). Fifty percent of EFFR daily rates fall within 157.71-156.15 bp, an IQR of 1.56 basis points, the TGCR and BGCR cluster even more tightly, under one bp (133), SOFR shows greater dispersion, 4.2 bp. (136.70-132.50).

Outliers The EFFR and money market rates are skewed with fatter tails. A large range means high variability, a small range means low variability. The range of the EFFR and the money market rates, two percent of the data, TGCR, BGCR, and SOFR in the sample are some 14 to 16 basis points - 15.99 (EFFR), 13.86 (TGCR), 16.11 (BGCR), and 14.51 (SOFR) basis points.

Volatility The change in volatility over time, the percent change in median reference rates, indicates heteroskedasticity in rate data. From 2016 to 2020, the percent change in these daily rates, ranges plus or minus 0.5 percent from 2016 to November 2019 (Figure @ref(fig:Volatility percent change daily rates 2016-2023)). From 2020 to 2022 during the pandemic until the Fed began its fight to contain inflation in 2023, the percent change in rates varies plus or minus 2 percent. Volatility falls steadily during the fight against inflation.

Volume The volume of SOFR transactions, \$754 billion per day, dwarf trading in all other EFFR and money market rates. EFFR has a notably lower daily trade volume of \$79 billion, TGCR and BGCR at around \$300 billion each (TGCR 296.95, BGCR 311.23). (Figure @ref(fig:Sample volumes of reference rates 3/4/2016-12/14/2023)).

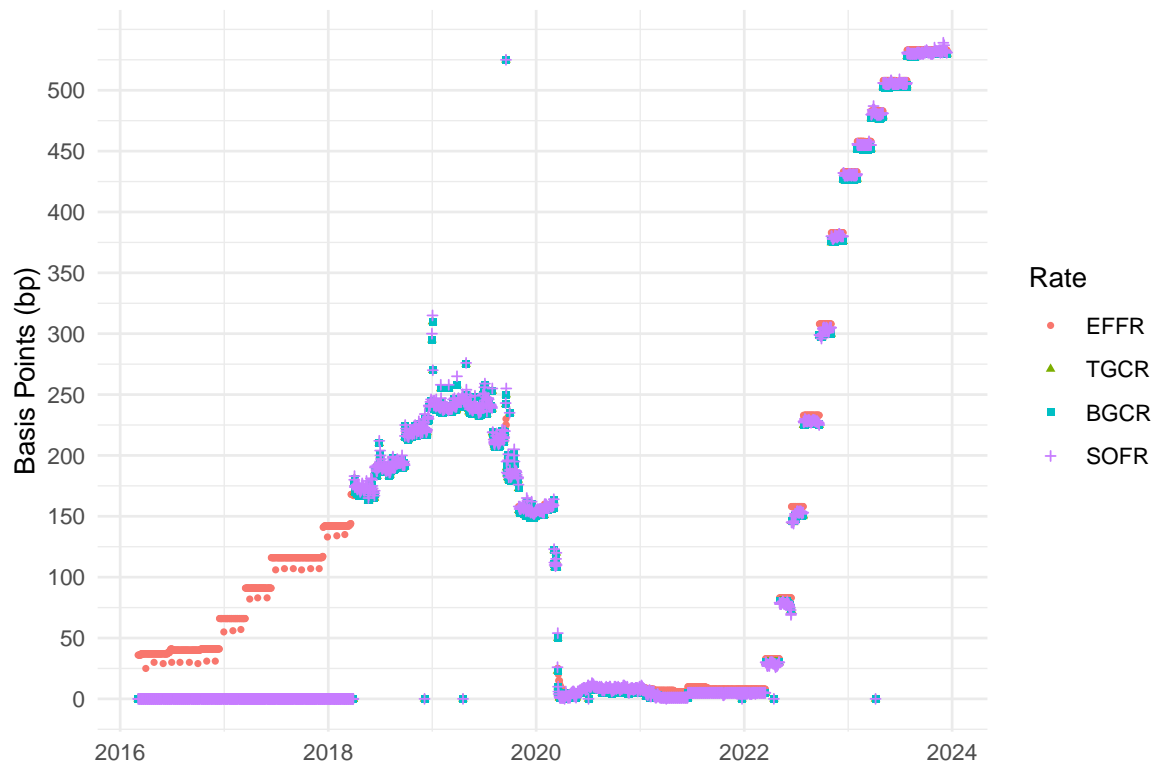
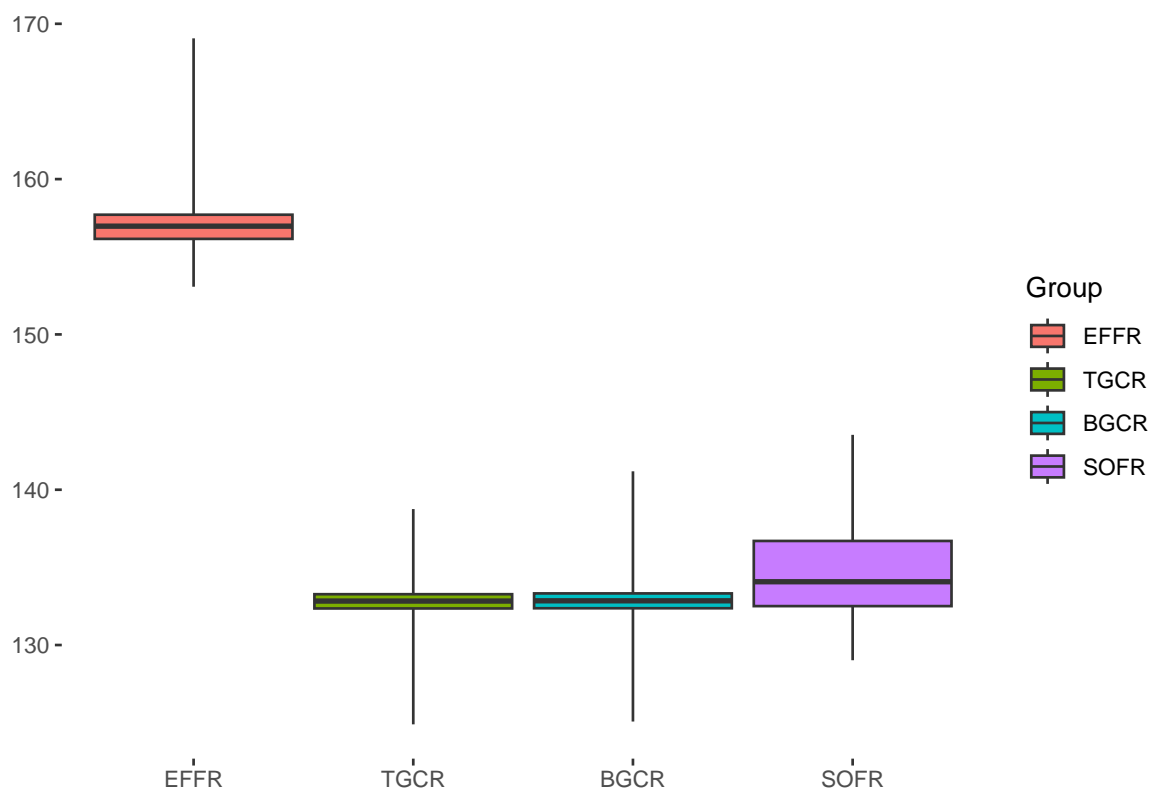


Figure 1: Sample reference rates 3/4/2016-12/14/2023



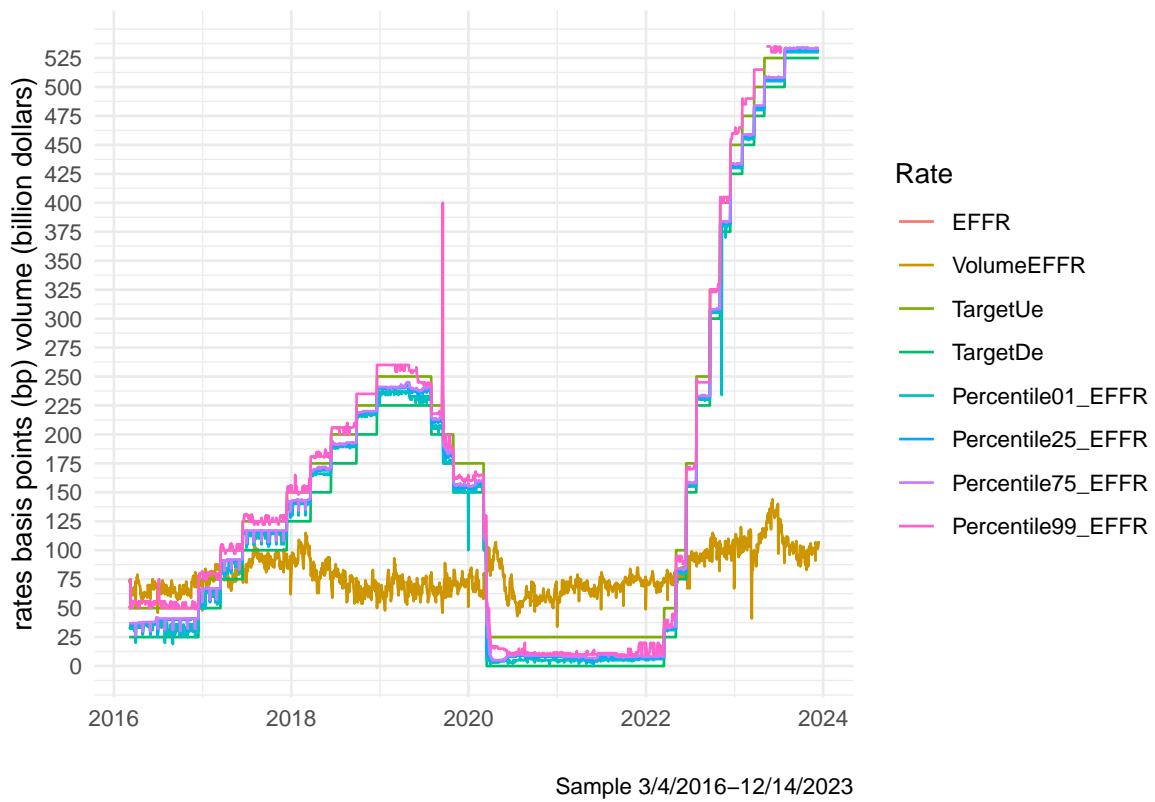


Figure 2: EFR percentiles of the sample 3/4/2016-12/14/2023

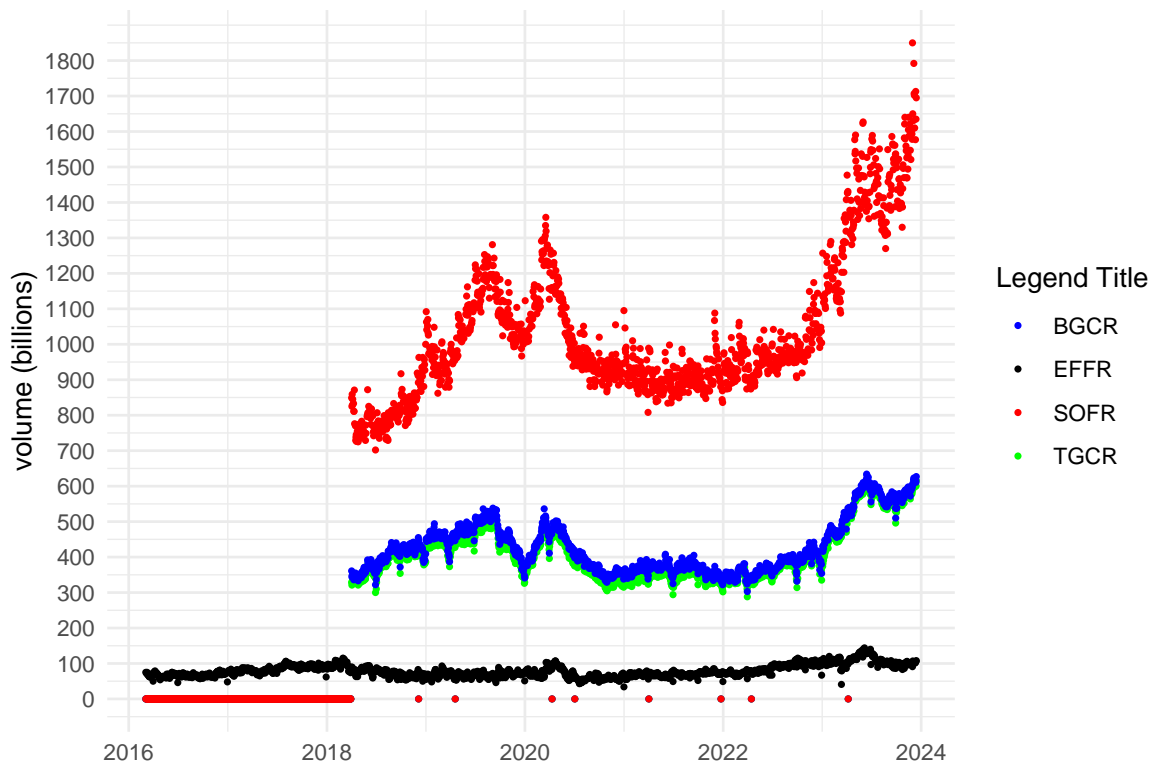


Figure 3: Sample volumes of overnight rates 3/4/2016-12/14/2023



Figure 4: Volatility percent change daily rates 2016-2023

	Date	From	To	Basis.points	Discount.rate	Votes
1	14-Dec-16	0.50	0.75	25	0.01	10-0
2	15-Mar-17	0.75	1.00	25	0.01	9-1
3	14-Jun-17	1.00	1.25	25	0.02	8-1
4	13-Dec-17	1.25	1.50	25	0.02	7-2
5	21-Mar-18	1.50	1.75	25	0.02	8-0
6	13-Jun-18	1.75	2.00	25	0.02	8-0
7	26-Sep-18	2.00	2.25	25	0.03	9-0
8	19-Dec-18	2.20	2.50	25	0.03	10-0
9	31-Jul-19	2.00	2.25	-25	0.03	8-2
10	18-Sep-19	1.75	2.00	25	0.03	7-3
11	30-Oct-19	1.50	1.75	-25	0.03	8-2
12	3-Mar-20	1.00	1.25	25	0.03	10-0
13	15-Mar-20	0.00	0.25	25	0.00	9-1
14	19-Mar-20	0.00	0.25	25	0.00	
15	23-Mar-20	0.00	0.25	25	0.00	
16	31-Mar-20	0.00	0.25	25	0.00	
17	29-Apr-20	0.00	0.25	25	0.00	
18	10-Jun-20	0.00	0.25	25	0.00	
19	29-Jul-20	0.00	0.25	25	0.00	
20	27-Aug-20	0.00	0.25	25	0.00	unanimous
21	16-Sep-20	0.00	0.25	25	0.00	
22	5-Nov-20	0.00	0.25	25	0.00	
23	16-Mar-22	0.25	0.50	25	0.00	8-1
24	4-May-22	0.75	1.00	25	0.01	9-0
25	15-Jun-22	1.50	1.75	25	0.02	8-1
26	27-Jul-22	2.25	2.50	25	0.02	12-0
27	21-Sep-22	3.00	3.25	25	0.03	12-0
28	2-Nov-22	3.75	4.00	25	0.04	12-0
29	14-Dec-22	4.25	4.50	25	0.04	12-0
30	1-Feb-23	4.50	4.75	25	0.05	12-0
31	22-Mar-23	4.75	5.00	25	0.05	11-0
32	3-May-23	5.00	5.25	25	0.05	11-0
33	14-Jun-23	5.00	5.25	0	0.05	11-0
34	26-Jul-23	5.25	5.50	25	0.06	11-0
35	20-Sep-23	5.25	5.50	0	0.06	12-0
36	1-Nov-23	5.25	5.50	0	0.06	12-0
37	13-Dec-23	5.25	5.50	0	0.06	12-0
38	31-Jan-24	5.25	5.50	0	0.06	12-0
39	20-Mar-24	5.25	5.50	0	0.06	12-0

	Date	Event
March 3, 2020	18324.00	Fed set rate of purchases
March 11, 2020	18332.00	Fed updated guidance
March 15, 2020	18336.00	Fed began tapering
March 16, 2020	18337.00	Fed doubled tapering speed
April 1, 2020	18353.00	Fed emergency rate cut
June 1, 2020	18414.00	WHO declares Covid-19 pandemic
August 28, 2020	18502.00	Fed slashes rates to zero
December 11, 2020	18607.00	Stock market crash
July 28, 2021	18836.00	Highest US unemployment since 1948
November 1, 2021	18932.00	Fed announces new strategy
December 1, 2021	18962.00	Fed holds rates steady
January 26, 2022	19018.00	Powell states labor market conditions
February 24, 2022	19047.00	Russia invades Ukraine
March 16, 2022	19067.00	Fed makes first rate increase since 2018
May 5, 2022	19117.00	Fed increases interest rates
June 1, 2022	19144.00	Inflation peaks
June 16, 2022	19159.00	Fed raises rates
July 28, 2022	19201.00	Fed hikes rates
September 22, 2022	19257.00	Fed delivers another rate increase
November 3, 2022	19299.00	Fed increases rates
December 15, 2022	19341.00	Fed raises rates
February 2, 2023	19390.00	Fed adds another increase
March 23, 2023	19439.00	Fed increases interest rates
May 4, 2023	19481.00	Fed hikes another increase
July 27, 2023	19565.00	Fed delivers final increase of 2023

Table 1: Important Events Timeline

	EFFR	TGCR	BGCR	SOFR
Rate	156.97	132.83	132.85	134.08
Volume	78.91	296.95	311.23	754.37
Upper target	170.52			
Lower target	145.52			
Percentile_01	153.07	124.89	125.07	129.02
Percentile_25	156.15	132.36	132.37	132.51
Percentile_75	157.71	133.27	133.32	136.70
Percentile_99	169.06	138.75	141.19	143.53

Table 2: Rate characteristics 2016-2023

	Category	Median	IQR	RANGE	VOLUME
1	EFFR	156.97	1.56	15.99	78.91
2	TGCR	132.83	0.92	13.86	296.95
3	BGCR	132.85	0.96	16.11	311.23
4	SOFR	134.08	4.20	14.51	754.37

Table 3: Sample 3/04/2016-12/14/2023

	EFFR	TGCR	BGCR	SOFR
Rate	133.79	83.83	83.84	84.78
Volume	75.86	158.53	166.42	350.22
Upper target	143.09			
Lower target	118.09			
Percentile_01	129.38	79.88	79.97	81.44
Percentile_25	133.33	83.44	83.45	83.55
Percentile_75	134.55	83.66	83.68	86.85
Percentile_99	147.02	85.50	88.44	89.97

Table 4: Normalcy 3/04/2016-7/31/2019

	Category	Median	IQR	RANGE	VOLUME
1	EFFR	133.79	1.22	17.65	75.86
2	TGCR	83.83	0.22	5.62	158.53
3	BGCR	83.84	0.23	8.48	166.42
4	SOFR	84.78	3.30	8.53	350.22

Table 5: Normalcy 3/04/2016-7/31/2019

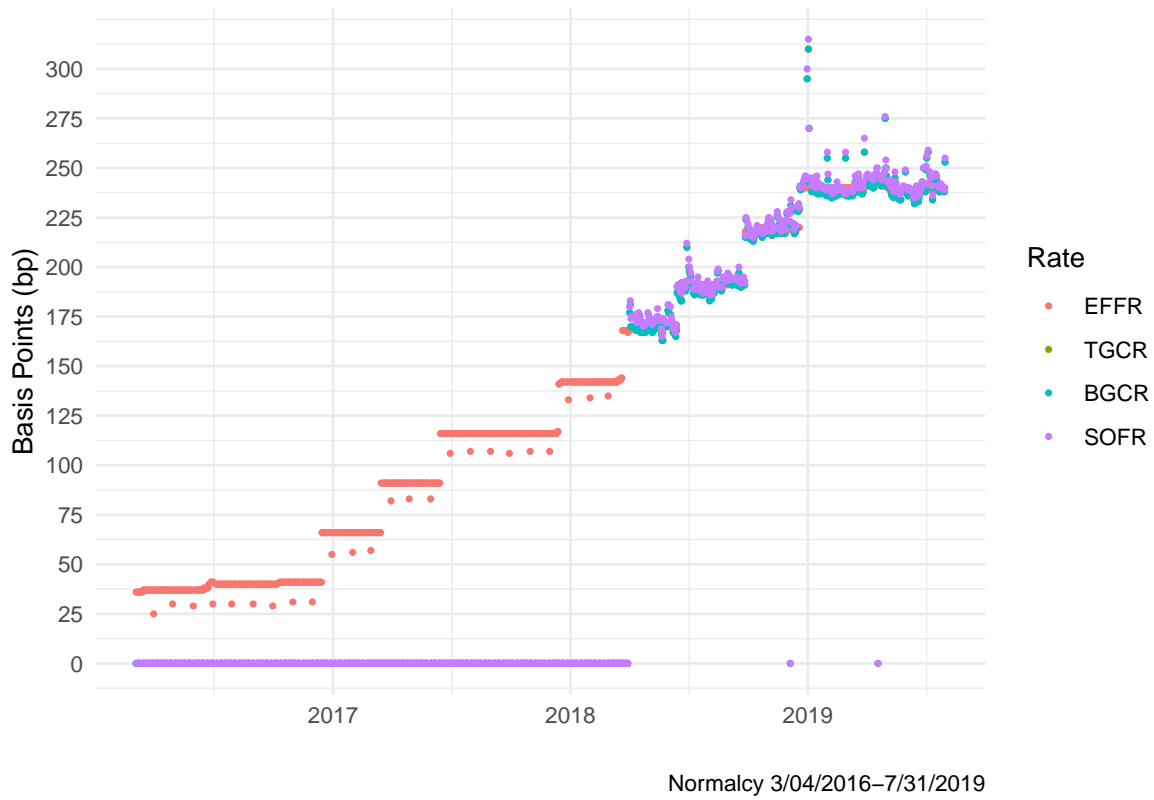
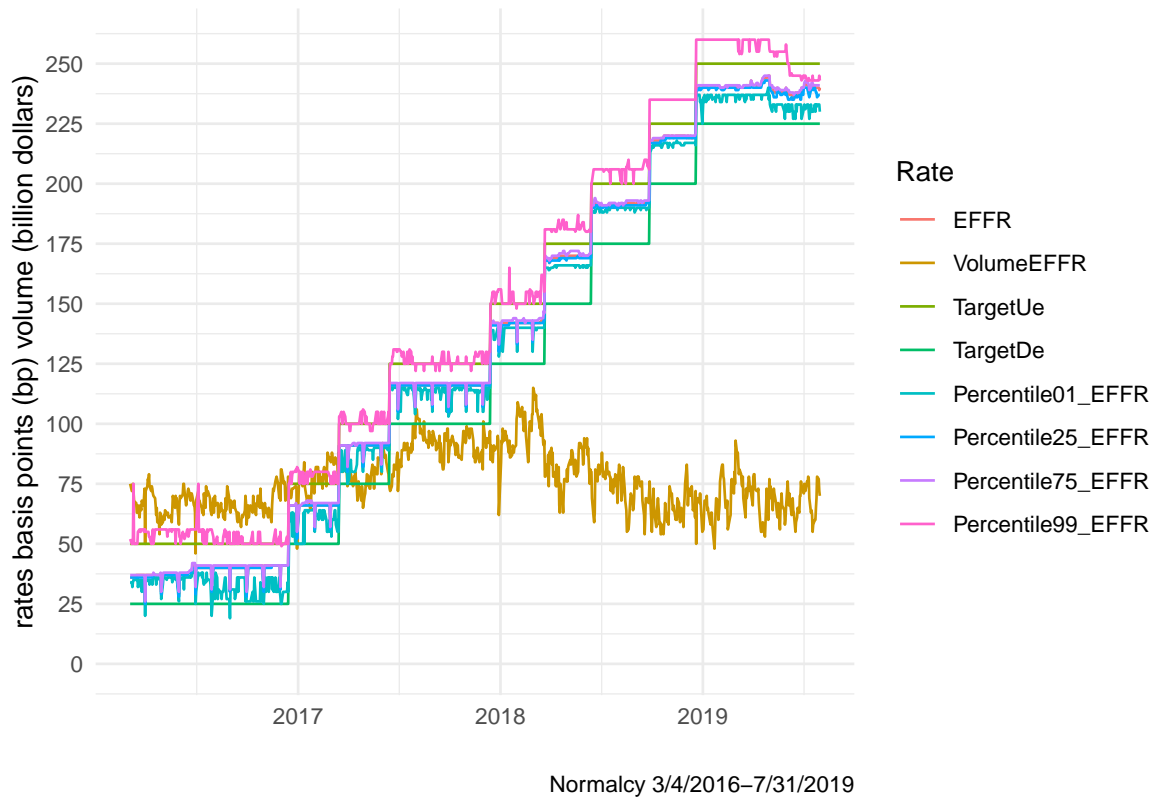


Figure 5: Rates during normalcy period 3/4/2016-7/31/2019



	EFFR	TGCR	BGCR	SOFR
Rate	200.09	206.30	206.34	208.22
Volume	66.84	466.22	492.47	1151.00
Upper target	212.89			
Lower target	187.89			
Percentile_01	192.08	191.66	191.80	196.47
Percentile_25	197.25	205.62	205.62	206.00
Percentile_75	201.91	206.92	206.98	216.53
Percentile_99	209.75	214.36	225.80	237.73

Table 6: Adjustment 8/1/2019-10/31/2019

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	Category	Median	IQR	RANGE	VOLUME
1	EFFR	183.59	12.84	146.05	1468.70
2	TGCR	248.51	6.71	274.56	1491.08
3	BGCR	254.84	15.29	300.67	1529.02
4	SOFR	369.33	25.88	954.53	2215.95

Table 7: Adjustment 8/1/2019-10/31/2019

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	EFFR	TGCR	BGCR	SOFR
Rate	150.46	148.64	148.64	151.19
Volume	71.70	401.74	423.19	1085.60
Upper target	168.96			
Lower target	143.96			
Percentile_01	145.80	142.08	142.30	145.62
Percentile_25	149.53	148.47	148.47	148.71
Percentile_75	151.88	148.78	148.89	156.09
Percentile_99	157.52	153.29	158.32	165.08

Table 8: Covid 03/17/2022-12/14/2023

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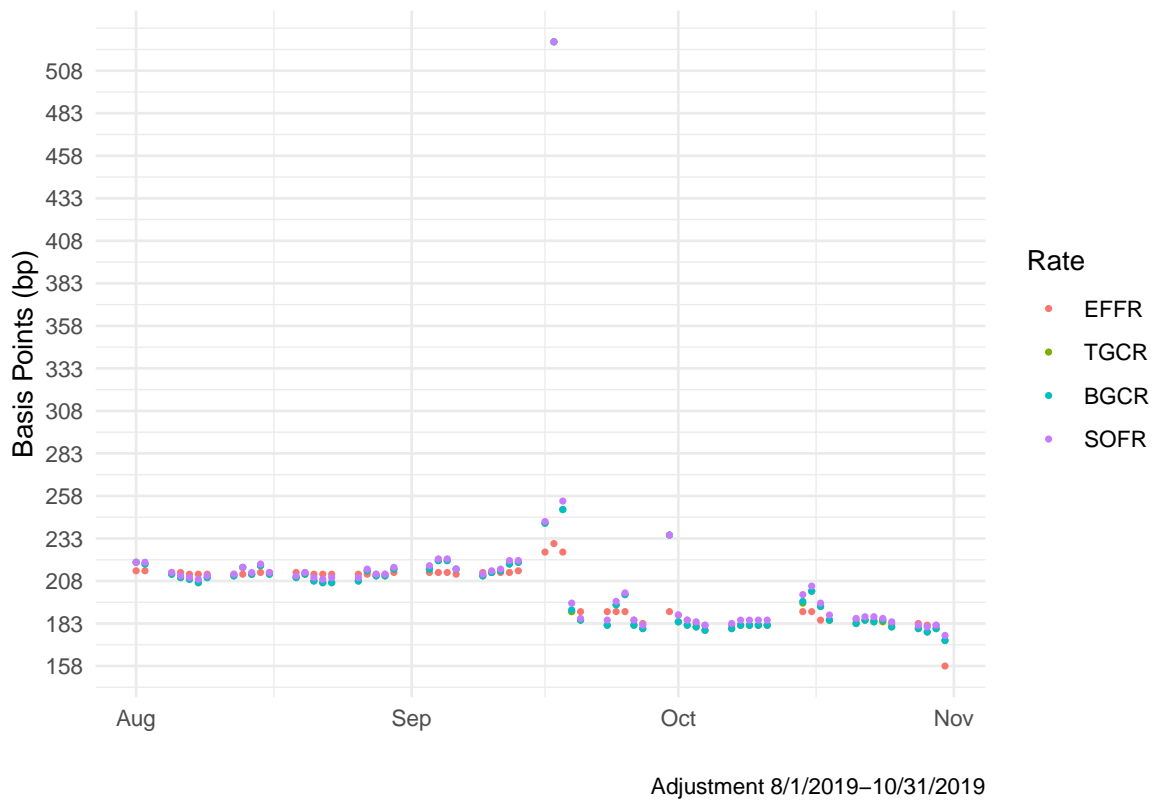


Figure 6: Rates during mid cycle adjustment 8/1/2019-10/31/2019

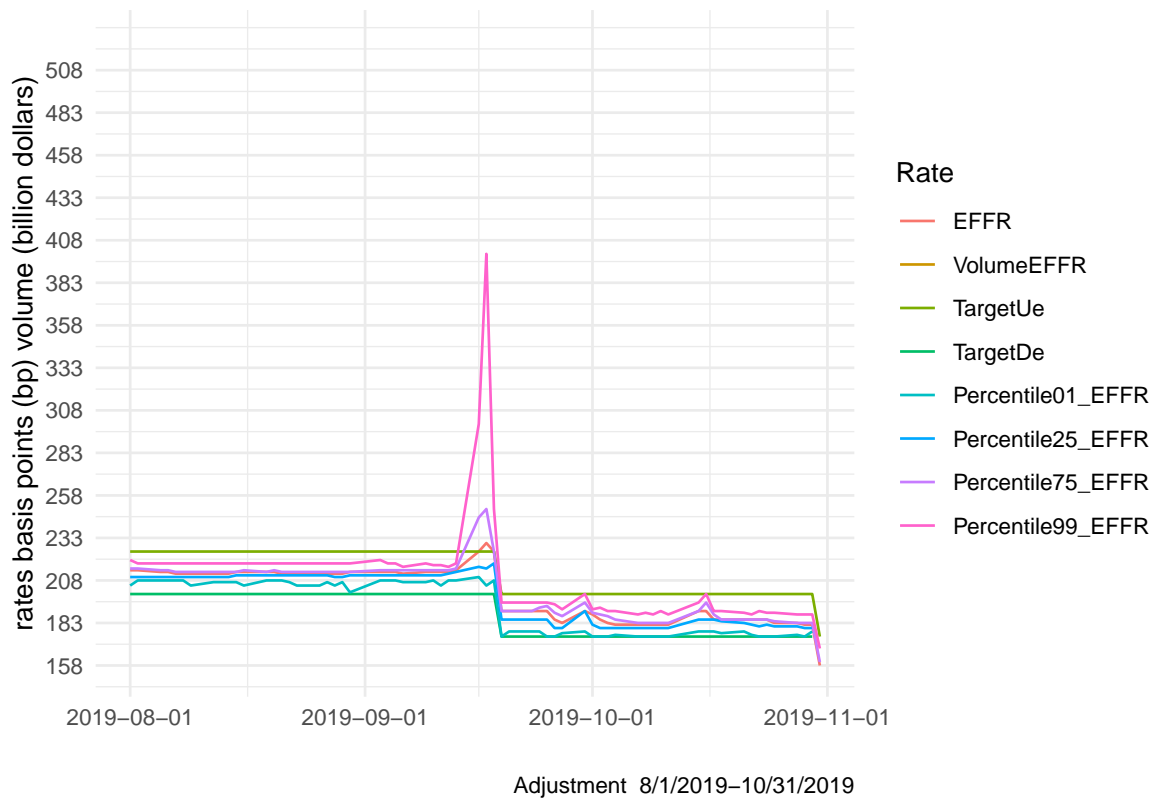
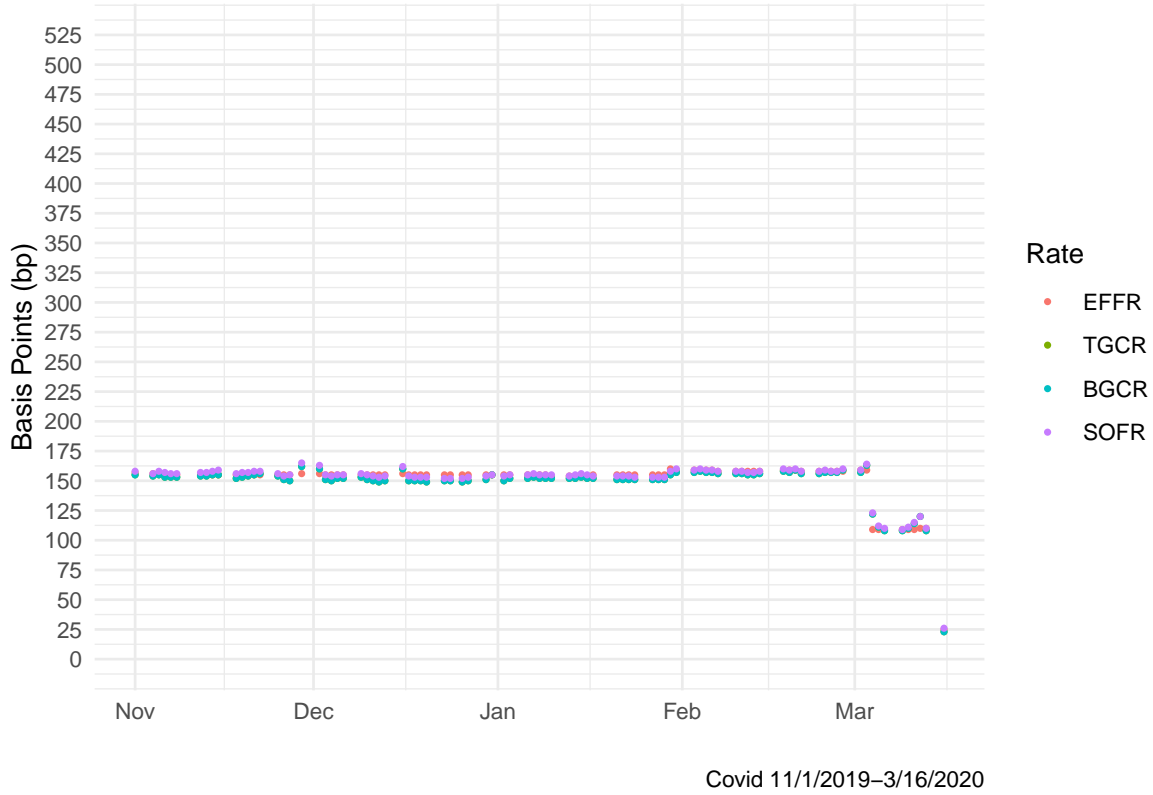


Figure 7: EFFR during adjustment period 8/1/2019-10/31/2019

	Category	Median	IQR	RANGE	VOLUME
1	EFFR	150.46	2.35	11.71	71.70
2	TGCR	148.64	0.31	11.21	401.74
3	BGCR	148.64	0.42	16.02	423.19
4	SOFR	151.19	7.37	19.46	1085.60



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	EFFR	TGCR	BGCR	SOFR
Rate	8.09	4.59	4.59	5.41
Volume	68.97	353.60	376.32	943.72
Upper target	25.00			
Lower target	0.00			
Percentile_01	5.07	2.08	2.05	1.57
Percentile_25	7.13	4.52	4.53	3.92
Percentile_75	8.67	4.65	4.67	6.97
Percentile_99	12.40	13.29	13.91	16.01

Table 9: Zero lower bound 03/17/2020-03/16/2022

% latex table generated in R 4.3.2 by xtable 1.8-4 package % Tue Jun 11 22:53:58 2024

	Category	Median	IQR	RANGE	VOLUME
1	EFFR	8.09	1.54	7.33	68.97
2	TGCR	4.59	0.12	11.21	353.60
3	BGCR	4.59	0.15	11.86	376.32
4	SOFR	5.41	3.05	14.44	943.72

Table 10: Rate statistics Zero lower bound 03/17/2020-03/16/2022

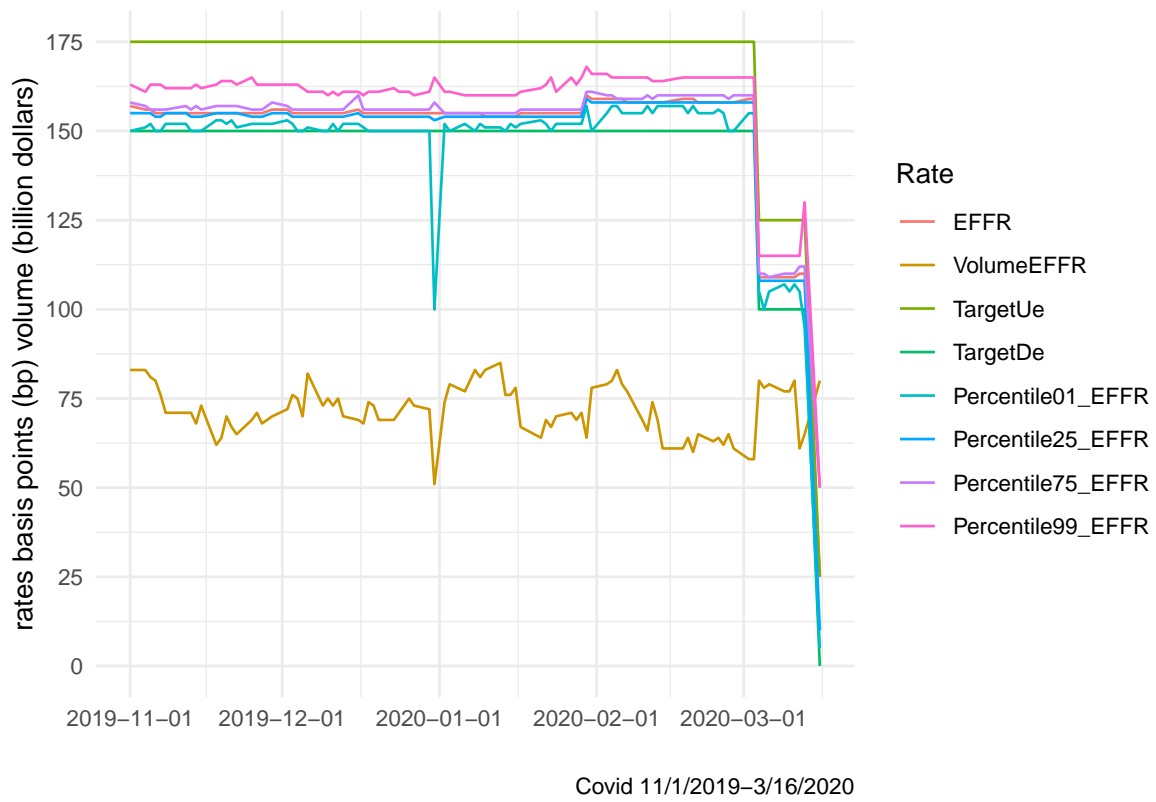


Figure 8: EFR during covid period 11/1/2019-3/16/2020

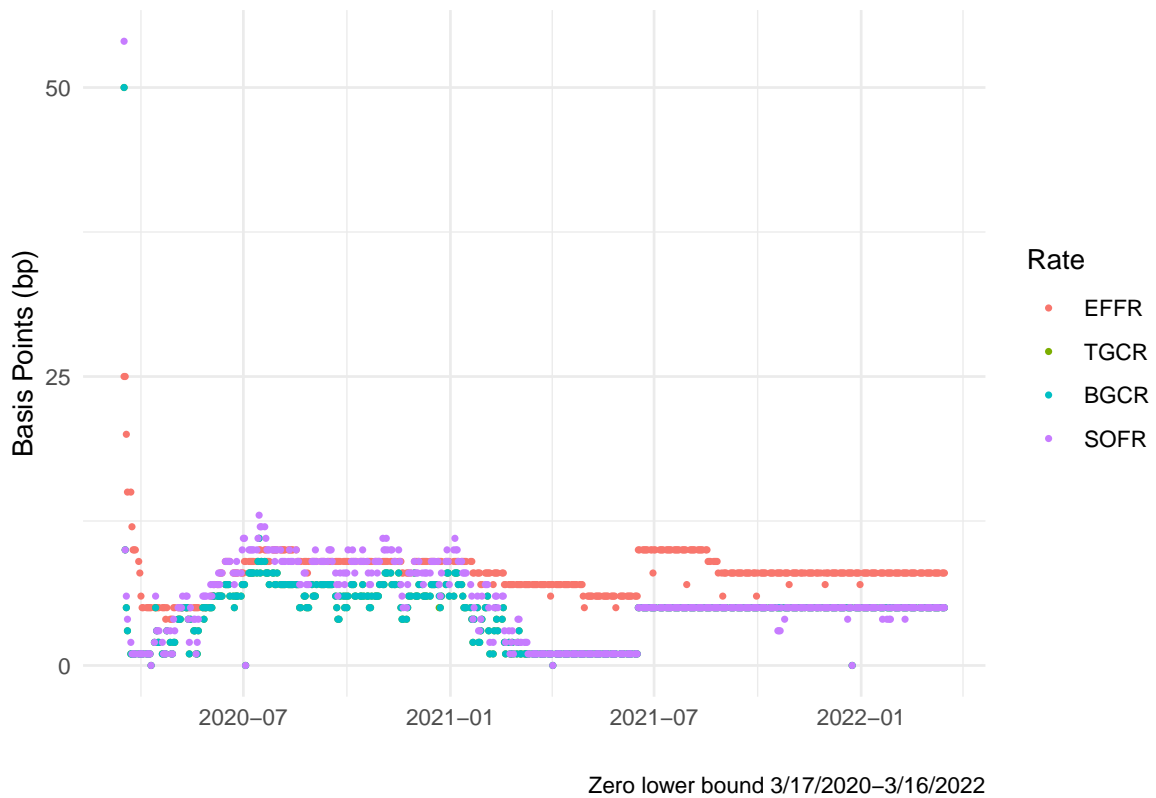


Figure 9: Rates during zero lower bound 3/17/2020-3/16/2022



Figure 10: EFRF during zero lower bound (zlb) period 3/17/2020-3/16/2022

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	EFRF	TGCR	BGCR	SOFR
Rate	368.60	362.14	362.20	364.07
Volume	99.56	455.92	469.75	1199.94
Upper target	385.65			
Lower target	360.65			
Percentile_01	365.45	340.85	341.46	355.36
Percentile_25	367.56	360.99	361.01	362.03
Percentile_75	369.18	364.26	364.38	367.71
Percentile_99	388.81	373.12	374.80	376.72

Table 11: Taming inflation 03/17/2022-12/14/2023

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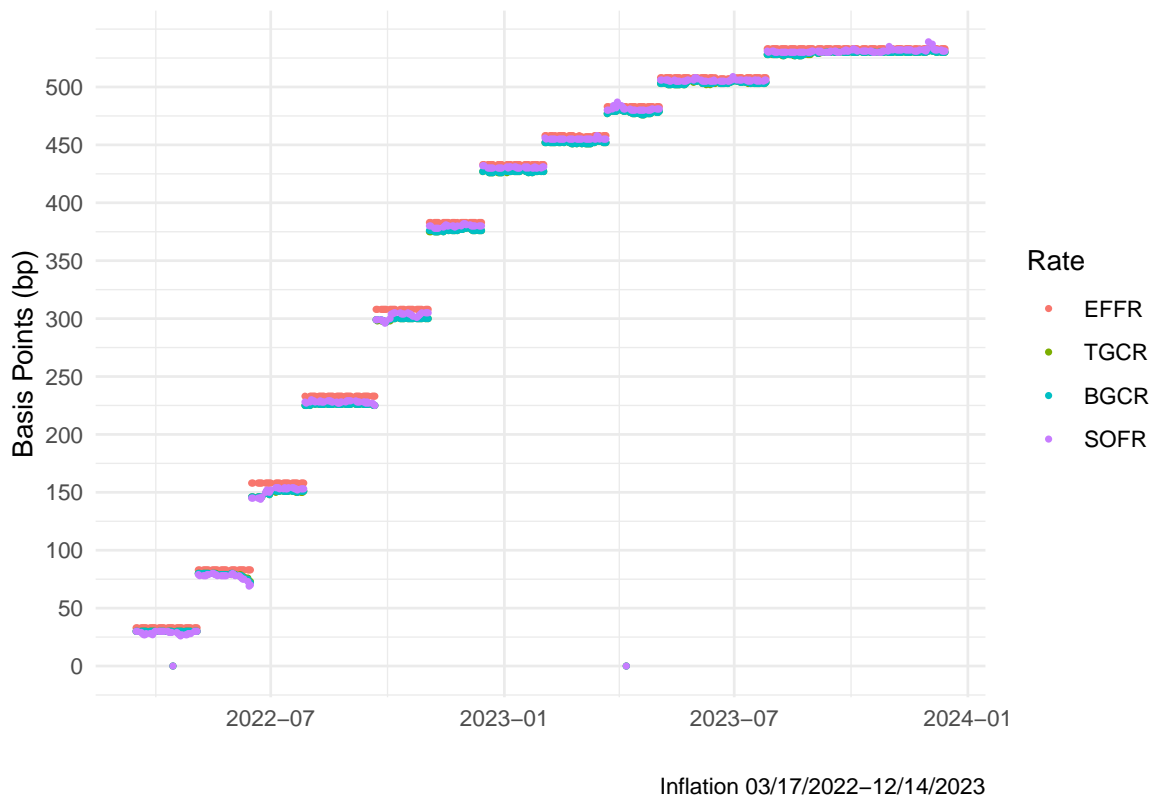


Figure 11: Rates during Taming inflation 3/17/2022-12/14/2023

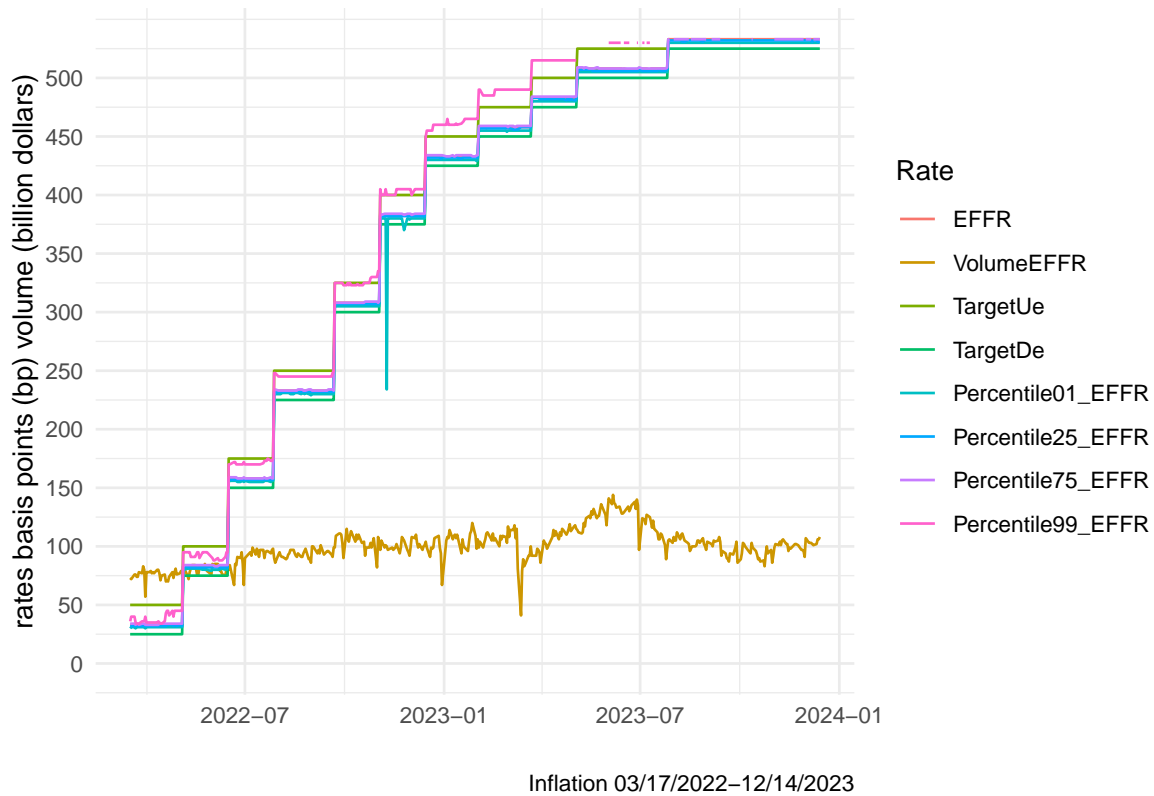
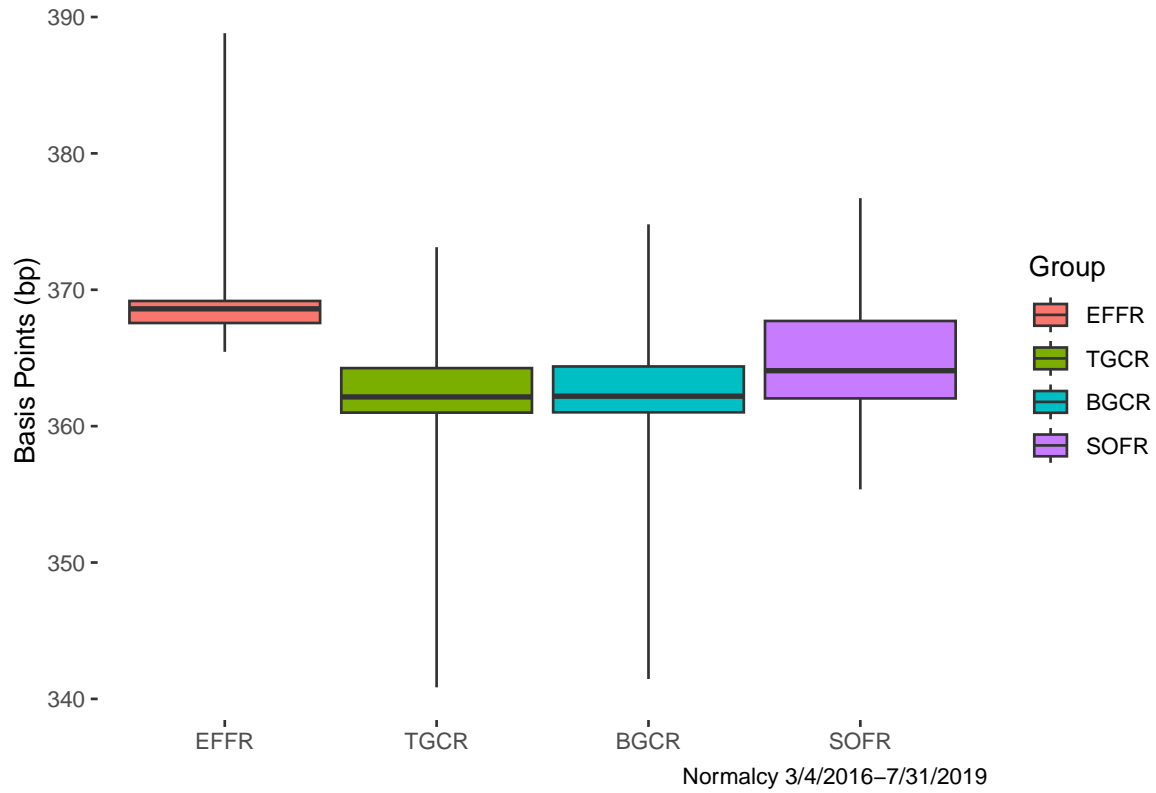


Figure 12: EFFR during inflation period 3/17/2022-12/14/2023

	Category	Median	IQR	RANGE	VOLUME
1	EFFR	368.60	1.62	23.36	99.56
2	TGCR	362.14	3.26	32.27	455.92
3	BGCR	362.20	3.36	33.34	469.75
4	SOFR	364.07	5.68	21.35	1199.94

Table 12: Rate statistics Taming inflation 03/17/2022-12/14/2023



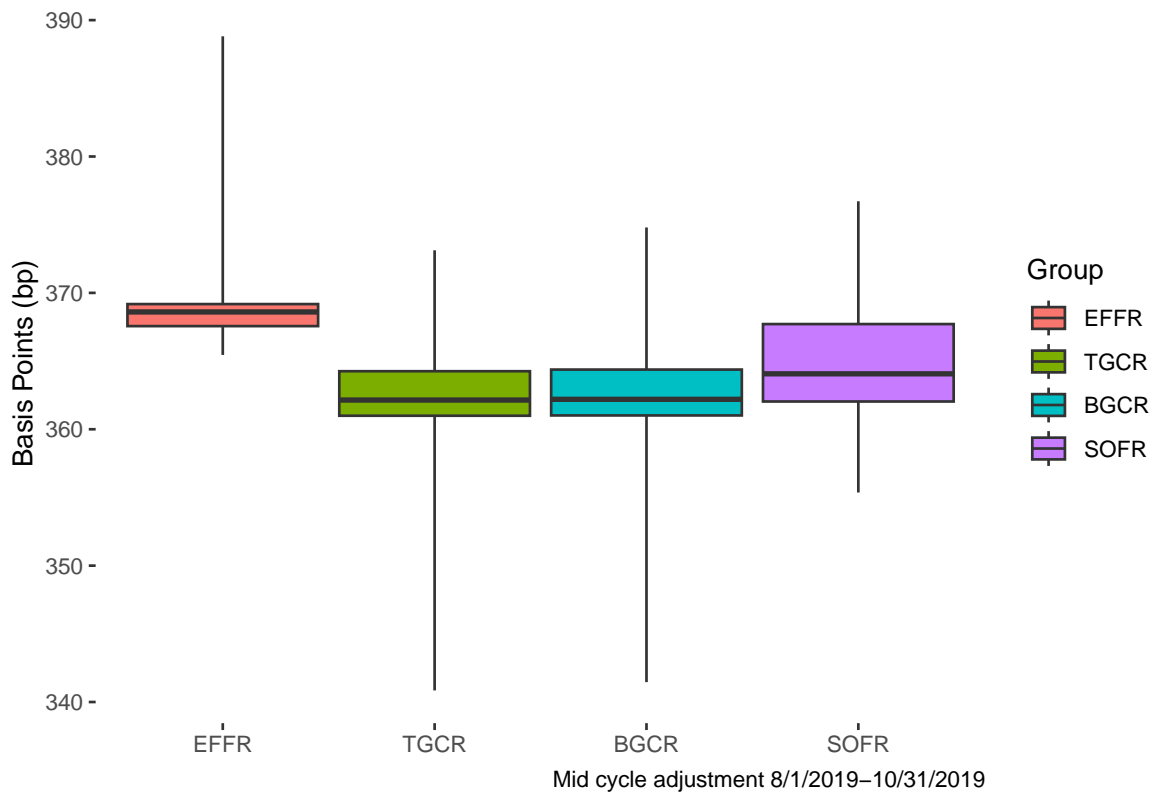


Figure 13: IQR and range of rates during mid cycle adustment period 8/1/2019-10/31/2019

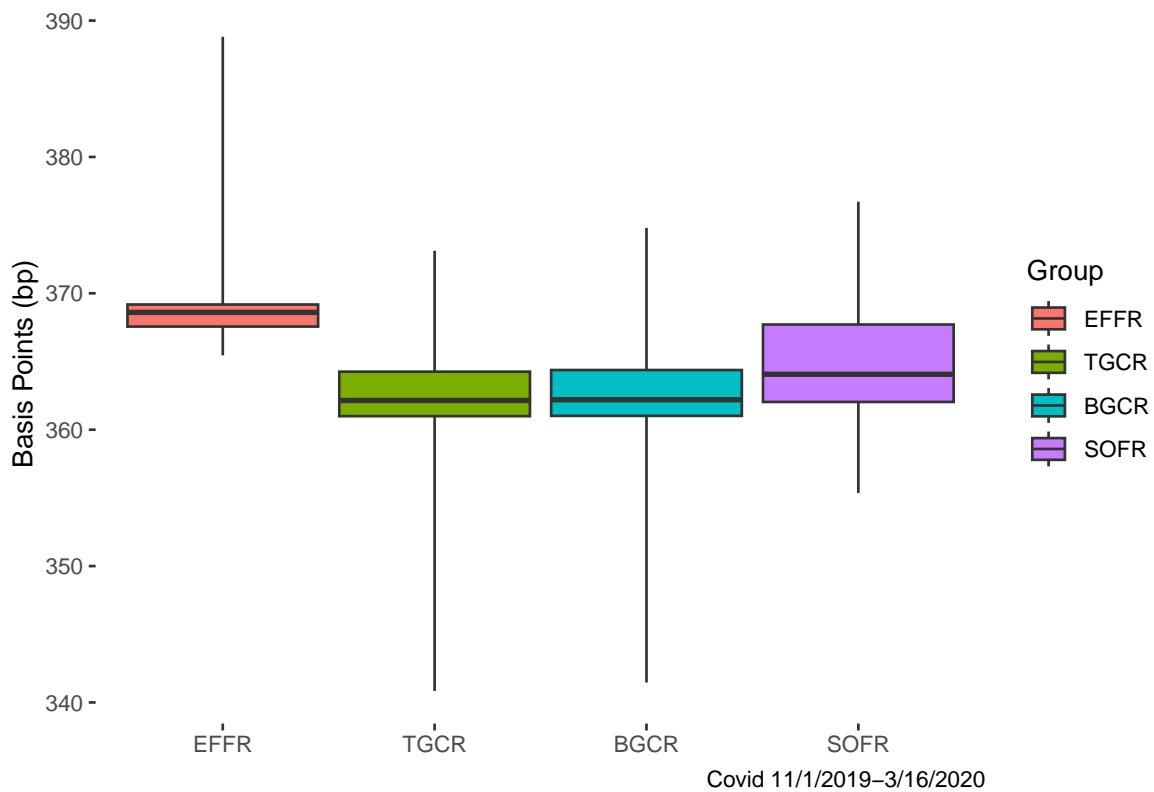


Figure 14: IQR and range of rates during covid period 11/1/2019-3/16/2020

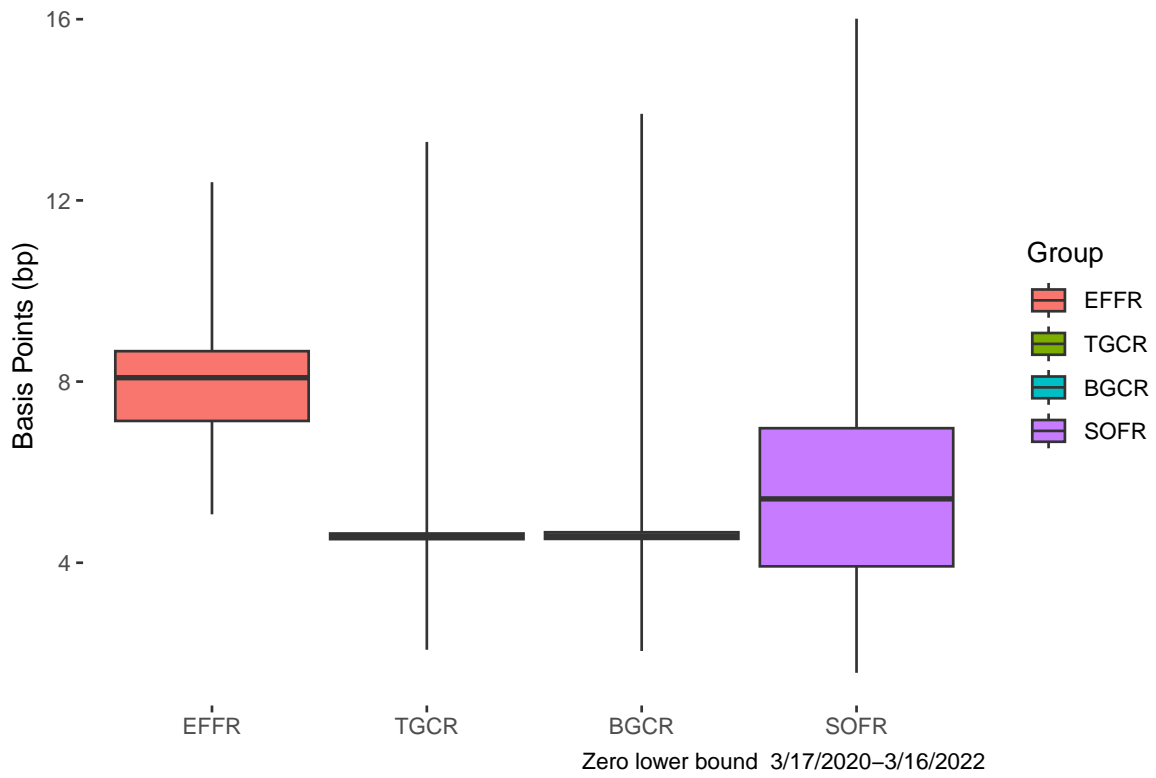
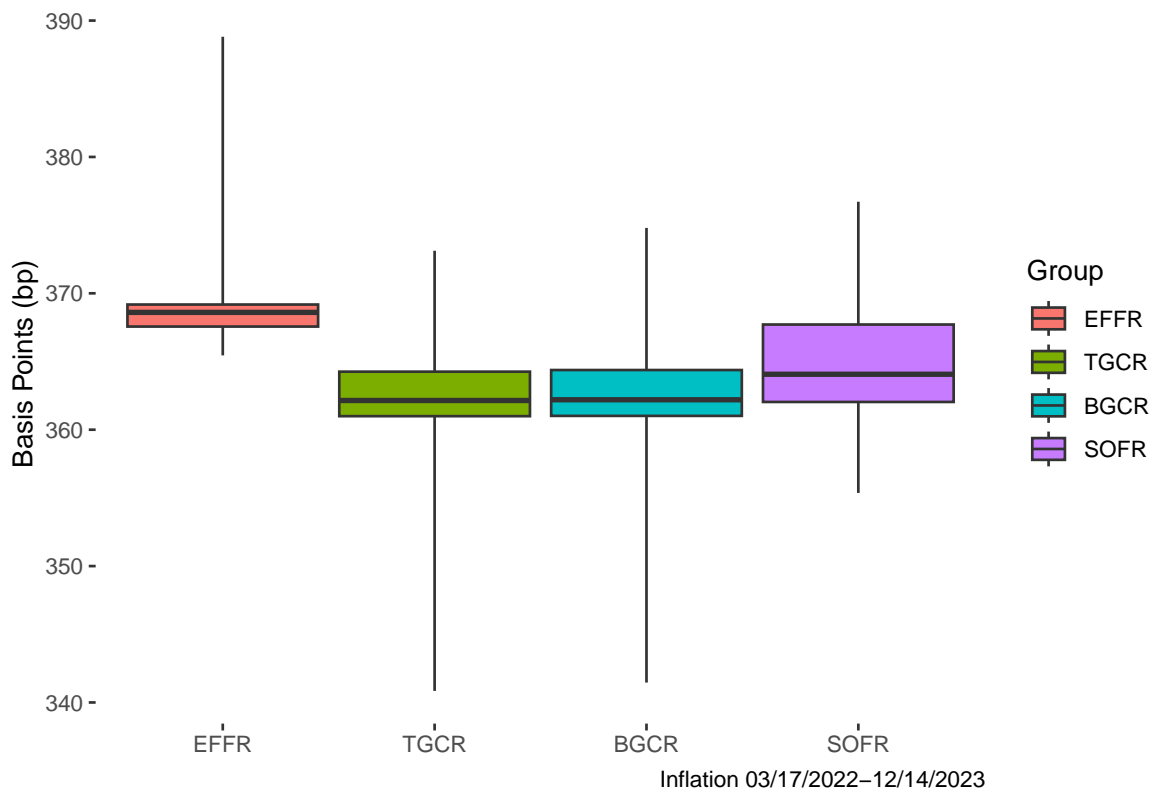


Figure 15: IQR and range of rates during zero lower bond period 3/17/2020-3/16/2022



4 Behavior the Federal Funds rate and money market rates during different policy episodes

The vertical shifts in rates from 2016 to 2023 suggest changes in distribution of rates during policy episodes. Forbes (2024) summarizes these monetary policy episodes. I have added the period of the zero lower bound. A more rigorous approach to identifying change in regimes is offered by (Valeria Gargiulo, Christian Matthes, and Katerina Petrova, 2024) and (Bianchi, Ludvigson, and Ma, 2024).

- Normalcy 3/4/2016 to 7/31/2019
- Mid cycle adjustment 8/1/2019 to 10/31/2019
- Covid 11/1/2019 to 3/16/2020
- Zero lower bound 3/17/2020 to 3/16/2022
- Taming inflation 03/17/2022 - 12/14/2023

4.1 The history of rates by policy episode

The EFFR and the money market rates during the normalcy period (Figure @ref{fig:ratestsnorm})

Rate hikes 2015-2018 Returning to normalcy

20-Dec-18 25 2.25% to 2.50% Sept. 27, 2018 25 2.0% to 2.25% Jun. 14, 2018 25 1.75% to 2.0% 22-Mar-18 25 1.50% to 1.75% Dec. 14, 2017 25 1.25% to 1.50% 15-Jun-17 25 1.00% to 1.25% 16-Mar-17 25 0.75% to 1.00% Dec. 15, 2016 25 0.5% to 0.75%

The EFFR and the money market rates during the adjustment period (Figure 6

2019 rates cuts mid cycle adjustment

31-Oct-19 -25 1.50% to 1.75% Sept. 19, 2019 -25 1.75% to 2.0% Aug. 1, 2019 -25 2.0% to 2.25%

The EFFR and the money market rates during the covid period (Figure ?? 2020 Fed Rate Cuts: Coping with Covid-19

16-Mar-20 -100 0% to 0.25% 3-Mar-20 -50 1.0% to 1.25%

The EFFR and the money market rates during the zero lower bound (Figure 9

The EFFR and the money market rates during the taming of inflation (Figure 11 from March 17, 2022 to December 14, 2023, the Fed raised the FFR in steady increments of 25, 50, and 75 bp.

Fed Rate Hikes 2022-2023: Taming Inflation

26-Jul-23 25 5.25% to 5.50% 3-May-23 25 5.00% to 5.25% 22-Mar-23 25 4.75% to 5.00% 1-Feb-23 25 4.50% to 4.75% 14-Dec-22 50 4.25% to 4.50% 2-Nov-22 75 3.75% to 4.00% 21-Sep-22 75 3.00% to 3.25% 27-Jul-22 75 2.25% to 2.50% 16-Jun-22 75 1.50% to 1.75% 5-May-22 50 0.75% to 1.00% 17-Mar-22 25 0.25% to 0.50%

4.2 Percentiles

Percentiles of the EFFR during the normalcy period (Figure ?? The EFFR, median and IQR values are within the FOMC target ranges (the step function for the lower and upper target rates, TargetDe, and TargetUe). The IQR and outliers are illustrated Figure @ref{fig:IQR and range of rates during normalcy period 3/4/2016-7/31/2019).

Percentiles of the EFFR during the adjustment period (Figure ?? The outlierS from the spike in repo rates September 2019 is the only time the FFR was not within the FOMC target range (Figure @ref{fig:IQR and range of rates during mid cycle adjustment period 8/1/2019-10/31/2019).

Percentiles of the EFFR during the pandemic (Figure ?? The outliers from the March 20, 2020 dash for cash are outside the FOMC target rate (Figure @ref(fig:IQR and range of rates during covid period 11/1/2019-3/16/2020)).

Percentiles of the EFFR during the zero lower bound (Figure 10 and (Figure @ref(fig:IQR and range of rates during zero lower bond period 3/17/2020-3/16/2022)).

Percentiles of the EFFR during the Fed's fight to control inflation (Figure 12 The EFFR and the IQR are within the FOMC target rates (Figure @ref(fig:IQR and range of rates during inflation period 3/17/2022-12/14/2023)).

% latex table generated in R 4.3.2 by xtable 1.8-4 package % Tue Jun 11 22:54:03 2024

	Sample	Normalcy	Adjust	Covid	Zlb	Inflation
EFFR	156.97	133.79	183.59	150.46	8.09	368.60
TGCR	132.83	83.83	248.51	148.64	4.59	362.14
BGCR	132.85	83.84	254.84	148.64	4.59	362.20
SOFR	134.08	84.78	369.33	151.19	5.41	364.07

Table 13: Median of rates during policy regimes

% latex table generated in R 4.3.2 by xtable 1.8-4 package % Tue Jun 11 22:54:03 2024

	Sample	Normalcy	Adjust	Covid	Zlb	Inflation
EFFR	1.56	1.22	12.84	2.35	1.54	1.62
TGCR	0.92	0.22	6.71	0.31	0.12	3.26
BGCR	0.96	0.23	15.29	0.42	0.15	3.36
SOFR	4.20	3.30	25.88	7.37	3.05	5.68

Table 14: Interquartile range (IQR) of rates during policy regimes

% latex table generated in R 4.3.2 by xtable 1.8-4 package % Tue Jun 11 22:54:03 2024

	Sample	Normalcy	Adjust	Covid	Zlb	Inflation
EFFR	15.99	17.65	146.05	11.71	7.33	23.36
TGCR	13.86	5.62	274.56	11.21	11.21	32.27
BGCR	16.11	8.48	300.67	16.02	11.86	33.34
SOFR	14.51	8.53	954.53	19.46	14.44	21.35

Table 15: Range of rates during policy regimes

The average median rates and percentiles illustrate the tendency of other rates to cluster around the EFFR.

Median daily reference rates the median illustrate

A measure of central tendency, the median of the reference rates EFFR and money market rates (@ref(tab:Rate characteristics 2016-2023)(top panel Table) illustrate how closely money market rates track the policy rate EFFR. The change in median rates during different episodes demonstrate the how their central tendency changes with monetary policy. Average median rates for the sample are 157 bp for the EFFR, and some 133-134 bp for the money market rates and SOFR. The difference in the central tendencies as measured by the median rate, changes dramatically over different policy episodes.

The sample EFFR 157 bp drops to 134 bp during the normalization period, 184 bp in the adjustment period bp, 150.46 bp during covid, 8.09 bp the zero lower bound, and 369 bp during the inflation fighting period. Rates hover near zero from March 2020 to March 2022 during the zero lower bound. Median rates during the inflation episode increased over 233 percent of the the sample average as the Fed raised the FFR in 25 or 50 basis point to tame inflation. Rates rose steadily from March 2022 to 533 bp in December 2023 some 235 percent of the sample median rate

The IQR and range provide more information about the series, how close they stay to their median values and also the extreme values characteristic of short rates (@ref(tab:IQR of rates during policy regimes)).

Variability: clustering of funding rates around their median (IQR) Small interquartile range (IQR) values are evidence that the EFFR and the money market rates, with the exception of SOFR, cluster more tightly around their median values for the sample as a whole (Table @ref(tab: IQR of rates during the policy regimes))(middle panel Table). For the sample, 1.54 bp for the EFFR, and under one bp for the money market rates. For different policy episodes the IQR is under 0.12 to 0.23 during normalcy and the zero lower bound, more disperse, over 1 bp during the adjustment periods and over 3bp during the inflation episode. Boxplots show the IQR, the location of the median and tails for the outliers. (Figure @ref(fig:IQR and range during normalcy period 3/4/2016-7/31/2019)) (Figure @ref(fig:IQR and rang during mid cycle adjustment period 8/1/2019-10/31/2019)) (Figure @ref(fig:IQR and rang during covid period 11/1/2019-3/16/2020)) (Figure @ref(fig:IQR and rang during zero lower bond period 3/17/2020-3/16/2022)) (Figure @ref(fig:IQR and rang during inflation period 3/17/2022-12/14/2023))

SOFR exhibits the greater variability; for the sample as a whole, IQR for SOFR is a high 4 bp. The dispersion of SOFR is even more diverse among policy regimes. SOFR rates have the largest spread around the median rate, reaching over 10 bp during the adjustment period. SOFR is more tightly clustered around its median during normalcy, 3.30 bp and the zero lower bound 3.05 bp, but 7.37 bp during covid and 5.68 bp during inflation. Concoda reports [reference] in February 2023, some 25% of repo trades were based on SOFR) a trillion dollar volume giving the Fed greater influence in global finance [check this claim from concoda]. However, NYFed data reveal SOFR rates to attain the largest spread in outliers versus tri party or bilateral repo.

Outliers The range of the data, the 99th and first percentile, is the spread from the lowest to the highest rates. More sensitive to outliers, the range represents 2 percent of the data, showing the magnitude of outliers under different policies (Table @ref(tab: Range of rates during policy regimes). The higher the range, the higher the variability. The spread outliers in the sample for all rates is 14 to 16 bp (bottom panel Table). During normalcy, the spread in money market rates and SOFR is 6 to 8 bp; the EFFR a higher 18 bp. Outliers soar during the period of adjustment, a spread of 18 bp, the EFFR reached 146 bp, the money market rates spread of 23- 34 bp, outliers reaching 275-300 bp. SOFR has the highest variability, a spread of 42 bp, reaching a whopping 954 bp. The spread of outliers during covid and the zero lower bound are lower than the sample range. Spreads of extreme rate vaues during the zero lower bond are lower than the sample, 7- 14 bp, some 11 to 12 bp for the money market rates TGCR and BGCR 7.33 for the EFFR, and 14.44 for SOFR. The spread 21 to 33 bp in outliers occurs during the Fed's attempt to contain inflation. some 23 basis points for the EFFR, the money market rates TGCR and BGCR 32-33 bp, and SOFR 21 bp. Again SOFR shows greater variability in all episodes (@ref(tab: Range of rates during policy regimes))

Volatility Heteroskedasticity of overnight rates, here measured as log percent changes in rates, is plus or minus 0.5 percent from 2016 to 2020. Extreme values during the periods of the pandemic and the zero lower bound, From 2020 to 2022, the percent change in rates varies plus or minus 2 percent. then tapers off as the Fed began its fight to contain inflation in 2023, within plus or minus 2 percent (@ref(fig:volatility Percent change Daily rates 2016-2023)).

Volume Daily volume in money market rates TBGR \$297 billion, and BGCR \$311 billion, almost quadruple the transactions in the EFFR: \$79 billion. SOFR transactions, \$754 billion per day, dwarf trading in all other overnight reference rates.

5 Methodology

I plan to explore methods proposed by Piazzesi, Bezoni et al and Jarocinsk,

I replicated Bertola et EGARCH with little success but will continue to find a first estimate for comparison with other methods.

Initial VARS revealed the near mean revision of reference rates, over tests of lagged rates 1, 2, 5, or 10 days. Money market rates visually adapted to the FFR. But I made no formal investigation.

Piazzesi (2005) constructs a continuous-time model of the joint distribution of bond yields and the FOMC interest rate target for the FFR. With high-frequency data in a linear-quadratic jump-diffusion model, she provides information about the exact timing of FOMC meetings. This information can improve bond pricing and ability to identify monetary policy shocks.

Both Federal Reserve and financial markets watch and depend on bond yields. Yield-based information may underlie the FOMC's policy decisions and describes Fed policy better than Taylor rules. The Fed's estimated policy rule reacts to information in the yield curve, especially yields with two year maturities, implying the Fed responds to some medium-run forecast of the economy. The short informational lag before Fed's policy decision, information available right before the FOMC meeting start provides a recursive identification scheme that turns the target forecast from right before the Federal Open Market Committee (FOMC) meeting into a high-frequency policy rule and the associated forecast errors into policy shocks.

Decisions about target moves result in a series of target values that looks like a pure jump process. Estimates reveals increased volatility of interest rates at all maturities in both FOMC meeting days and releases of key macroeconomic data. Macro news releases change the conditional distribution of a future Fed move.

(Andersen, Benzoni, Lund, 2004) model the U.S. short-term interest rate 3 month Tbill with a three-factor jump-diffusion model, a time-varying mean reversion factor, a stochastic volatility factor, and a jump process. The U.S. short-term interest rate is characterized by complex conditional heteroskedasticity, fat-tailed innovations, and pronounced autocorrelation patterns. Stochastic volatility is critical for a good fit. Benzoni et al identify mean reversion of the short rate around a central tendency. The stochastic mean allows a relatively fast mean-reversion of the short rate around a highly persistent time-varying central tendency process. Jumps are integral to the quality of fit and relieve the stochastic volatility factor from accommodating extreme outlier behavior.

The mean drift may be indicative of slowly evolving inflationary expectations (Gara horiz?), time-variation in the required real interest rate, or both.

Estimating the Fed's unconventional policy shocks Javorscinski () estimates the structural shocks that underlie the reactions of financial market to FOMC announcements. While the nature of the shocks is not specified ex ante, ex post the estimated shocks can be naturally labeled as the current fed funds rate policy, an "Odyssean" forward guidance (a commitment to a future course of policy rates), a large scale asset purchase and a "Delphic" forward guidance (a statement about the future course of policy rates understood as a forecast of the appropriate stance of the policy rather than a commitment (Campbell et al., 2012).

[Alvarez] metrics for kurtosis

!<- 2. Affine Term Structure Models in the Handbook of Financial Econometrics, Elsevier Monika Piazzesi Department of Economics, Stanford University, Stanford, California

Several aspects of bond yields, however, set them apart from other variables typically used in VAR studies. One aspect is that bonds are assets, and that bonds with many different maturities are traded at the same time. Bonds with long maturities are risky when held over short horizons, and risk-averse investors demand compensation for bearing such risk. Arbitrage opportunities in these markets exist unless long yields are risk-adjusted expectations of average future short rates. Movements in the cross section of yields are therefore closely tied together. These ties show up as cross-equation restrictions in a yield-VAR. Another aspect of yields is that they are not normally distributed, at least not until recently. This makes it difficult to compute the risk-adjusted expected value of future short rates.

Term structure models capture exactly these aspects of bond yields. They impose the cross-equation restrictions implied by no-arbitrage and allow yields to be nonnormal. The word "affine term structure model" is often used in different ways. I will use the word to describe any arbitrage-free model in which bond yields are affine (constant plus-linear) functions of some state vector x . 1 Affine models are thus a special class of term structure models, which write the yield $y(\tau)$ of a τ -period bond as $y(\tau) = A(\tau) + B(\tau)x$ for coefficients $A(\tau)$ and $B(\tau)$ that depend on maturity τ . The functions

$A(\tau)$ and $B(\tau)$ make these yield equations consistent with each other for different values of τ . The functions also make the yield equations consistent with the state dynamics.

The functional form of bond yields is obtained from computing risk-adjusted expectations of future short rates. Therefore, restrictive assumptions have to be made on the risk-adjusted dynamics of the state vector. More concretely, the risk-adjusted process for the state vector needs to be an affine diffusion, a process with affine instantaneous mean and variance.

Why Care About Bond Yields: forecasting monetary policy debt policy derivative pricing and hedging computed from a given model of the yield curve (see the references in Duffie et al., 2000). Banks need to manage the risk of paying short-term interest rates on deposits while receiving long-term interest rates on loans.

policy shocks on long-term bonds outside of a yield-curve model. More patience is required to estimate a system of yield equations in a way that ensures no-arbitrage. The cross-equation restrictions have to be derived from parameters that describe the state dynamics and risk premia. Although the model is affine in the state vector x , the functions $A(\tau)$ and $B(\tau)$ are nonlinear functions of the underlying parameters

Cross-equation restrictions have many advantages. First, these restrictions ensure that the yield dynamics are consistent. $A(\tau)$ and $B(\tau)$ make yield equations consistent with each other in the cross section and the time series.

Second, term structure models allow us to separate risk premia from expectations about future short rates.

EH under which expected excess bond returns are zero. Modified versions of the EH have been tested under which expected excess returns are constant. These tests compare, e.g., the ratio of the likelihood function with and without restrictions implied by the EH (for references, see Bekaert and Hodrick, 2001). The evidence suggests that expected returns on long bonds are on average higher than on short bonds and that they are time-varying. Cross-equation restrictions are then needed to model these risk premia. Third, unrestricted regressions imply that the number of variables needed to describe the yield curve equals the number of yields in the regression.

2. BASICS 2.1. Bond Pricing in Continuous Time Term structure modeling determines the price of zero-coupon bonds The pricing relation (2.2) shows that any yield-curve model consists of two ingredients:

- (i) the change of measure from Q to Q^* and
- (ii) the dynamics of the short rate r under Q^* . In so-called factor models of the yield curve, (ii) is replaced by the following assumption: (ii)' the short rate r is a function $R(x)$ of x and $x \in R^N$ is a time-homogeneous Markov process under Q^* . This means that x is the relevant state vector, a vector of factors. This modified (ii) assumption implies that the conditional expectation in (2.2) is some function F of time-to-maturity τ and the state x_t at time t , or $P(\tau)_t = F(x_t, \tau)$. To capture certain features of yield data (e.g., seasonalities around macroeconomic news releases), I will later consider functions R that also depend on time t and time-inhomogeneous Markov processes x , in which case $P_t^\tau = F(x_t, t, \tau)$ separately depends on t and τ (in addition to x_t)

The payoff of zero-coupon bonds is 1 unit at maturity, so their price is CORRECT (2.2) where E^* denotes expectation under Q^* . Standard results show that if there exists a risk-neutral probability measure Q^* , a system of asset prices is arbitrage free

The big advantage of pricing bonds (or any other assets) in continuous time is Ito's Lemma. The lemma says that smooth functions F of some Ito process x and time t are again Ito processes (see Duffie, 2001, Chapter 5 for details). The lemma thus preserves the Ito property even if F is nonlinear. Ito's Lemma allows me to turn the problem of solving the conditional expectation in (2.2) into the problem of solving a PDE for the bond price $F(x, \tau)$. The trick of computing (2.2) by solving a PDE is called the Feynman-Kac approach.

2.2. Local Expectations Hypothesis The LEH states that the pricing relation (2.2) holds under the data-generating measure Q . Bond yields are thus given by LEH : 3) CORRECT (2.4) where $S = \int_t^{t+\tau} r du$

(as above). The LEH therefore amounts to risk-neutral pricing: the data-generating measure Q and the risk-neutral measure Q^* coincide. This means that expected excess returns on long bonds are zero. The LEH is not the same as the more prominent EH, which states that bond yields y_t^T are expected values of average future short rates, or EH : $\gamma_t^T = \frac{E_t(S)}{\tau}$. (2.5)

The difference between the two hypotheses (2.4) and (2.5) is due to Jensen's inequality. For example, suppose that the short rate is Gaussian under $Q = Q^*$, which implies that Affine Term Structure Models S is also Gaussian (as the sum of Gaussians). With this normality assumption, Eq. (2.4) becomes CORRECT which differs from (2.5) because of the variance term.

3. AFFINE MODELS Affine term structure models make functional-form assumptions in step (ii)' of yield curve modeling, which lead to tractable pricing formulas. The functional-form assumptions are on the short-rate function $R(x)$ and the process x for the state vector under the risk-neutral measure. The functional form is affine in both cases:
 - $R(x)$ is affine
 - x is an affine diffusion under Q^* :
 - the drift $\mu_x^*(x)$ is affine
 - the variance matrix $\sigma_x^*(x)\sigma_x^*(x)'$ is affine.

These functional forms are for coefficients under the risk-neutral measure. In particular, the drift $\mu_x(x)$ is affine under the data-generating measure only when $\sigma_x(x)\sigma_\xi(x)$ is affine, which can be seen from (2.12). The next sections make these assumptions more precise and show that bond prices $F(x, \tau)$ are exponential-affine in x . In this setting, yields are thus affine in x which explains the name of this class of models.

3.1. Affine Short Rate The functional form of the short rate is made precise in the following assumption. Assumption 1 The short rate is given by $r = R(x) = \delta_0 + \delta_1 x$ for 4) CORRECT

The choice of short-rate parameters [CORRECT 5] depends on the number of factors in the model. The short rate usually is the factor in one-factor models, which means 5 The short rate in one-factor models is Markov. In N-factor models, the short rate alone is not Markov, but the short rate together with N-1 yields is typically Markov. The short rate often serves as one of the factors in multidimensional models. In this case, we still have 5 . Long yields still depend on the other factors because the expected future path of the short rate depends on the current state x in (2.2), when the short rate covaries with these other factors under the risk-neutral measure. ->

6 Results

7 Conclusion

8 References

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@{article, author = {Andersen, Torben and Benzoni, Luca and Lund, Jesper}, year = {2004}, month = {01}, pages = {}, title = {Stochastic volatility, mean drift, and jumps in the short-term interest rate} }
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article_citation <- list( author = c("Hamilton, James D."), year = 1996, month = 02, title = "The Daily Market for Federal Funds.", journal = "Journal of Political Economy", volume = "104", issue = "1", type = "article" )
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<!-- Campbell, Jeffrey R., Charles L. Evans, Jonas D. M. Fisher, and Alejandro Justiniano (2012) "Macroeconomic Effects of Federal Reserve Forward Guidance," Brookings Papers on Economic Activity, 1–80, https://EconPapers.repec.org/RePEc:bin:bpeajo:v:43:y:2012:i:2012-01:p:1-80. -->
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article_citation <- list( author = c("Campbell, Jeffrey R., Charles L. Evans, Jonas D. M. Fisher, and Alejandro Justiniano"), year = 2012, month = 04, title = "Macroeconomic Effects of Federal Reserve Forward Guidance", volume = "113", issue = "2", pages = "1-80", type = "Brookings Papers on Economic Activity" ) article_citation <- list( author = c("Piazzesi, Monika"), year = 2005, month = 04, title = "Bond Yields and the Federal Reserve", volume = "113", issue = "2", pages = "311-344", type = "Article" )
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article_citation <- list( author = c("Afonso, Gara", "Kyungmin, Kim", "Martin, Antoine", "Potter, Simon", "Schulhofer-Wohl, Sam"), year = 2004, month = 01, title = "Stochastic volatility, mean drift, and jumps in the short-term interest rate", type = "article" )
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article_citation <- list( author = c("Afonso, Gara", "Cipriani, Marco", "La Spada, Gabriele"), year = 2022, month = 12, title = "Banks' Balance-Sheet Costs, Monetary Policy, and the ON RRP", type = "NY Federal Reserve staff report NO. 1041" )
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article_citation <- list( author = c("Afonso, Gara", "Logan, Lorie", "Martin, Antoine", "Riordan, William", "Zobel, Patricia"), year = 2022, month = 1, title = "Reverse Repo Facility Works", type = "Federal Reserve Bank of New York Liberty Street Economics" url{https://libertystreeteconomics.newyorkfed.org/2022/1/how-the-feds-overnight-reverse-repo-facility-works/} )
```

```
article_citation <- list( author = c("Bertolini, L.", "Bertola", "Prati"), year = 2000, month = 12, title = "Day-To-Day Monetary Policy and the Volatility of the Federal Funds Interest Rate", type = "IMF Working Paper" )
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article_citation <- list( author = c("Andersen, Torben", "Benzoni, Luca", "Lund, Jesper"), year = 2004, month = 01, title = "Stochastic volatility, mean drift, and jumps in the short-term interest rate", type = "article" )
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article_citation <- list( author = c("Romer, Christina D.", "Romer, David H."), year = 2023, month = 04, title = "DOES MONETARY POLICY MATTER? THE NARRATIVE APPROACH AFTER 35 YEARS", type = "NBER Working Paper 31170" )
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article_citation <- list( author = c("Bianchi, Francesco", "Ludvigson, Sydney C.", "Ma, Sai"), year = 2024, month = 01, title = "Monetary-Based Asset Pricing: A Mixed-Frequency Structural Approach", type = "NBER Working Paper" )
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article_citation <- list( author = c("Jarocinski, Marek"), year = 2022, month = 06, title = "Estimating the Fed's unconventional policy shocks", type = "article ECB working paper" )
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article_citation <- list( author = c("Adams, Michael"), year = 2024, month = 05, title = "Federal Funds Rate History 1990 to 2024", type = "https://www.forbes.com/advisor/investing/fed-funds-rate-history/" )
```

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9 Appendix