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# Runs and Flights to Safety: Are Stablecoins the New Money Market Funds? \*

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#### **Abstract**

Similar to the more traditional money market funds (MMFs), stablecoins aim to provide investors with safe, money-like assets. We investigate similarities and differences between these two investment products. Our key finding is that, like MMFs, stablecoins also suffer from "flight-to-safety" dynamics. This is manifested in net flows from riskier to safer stablecoins on days of crypto-market stress. The same flight-to-safety dynamics also characterized flows during stablecoin runs, as exemplified by the two most severe episodes in 2022 and 2023. Furthermore, as flight-to-safety flows occur within MMF families, stablecoin flows tend to occur within blockchains.

JEL classification: G10, G20, G23.

**Keywords:** Stablecoins, Money Market Mutual Funds, Financial Stability, Crypto Assets, Runs, Liquidity Transformation.

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## 1 Introduction

Stablecoins are crypto assets that seek to maintain a stable price (usually \$1) such that they can serve as a form of money—a store of value and medium of exchange (e.g., Gorton and Zhang, 2021).¹ Stablecoin market capitalization has grown exponentially over the past ten years. While they were initially used mainly in the trading of other, more speculative crypto assets, their proponents have argued for a potentially much wider adoption of stablecoins as a form of money, particularly in cross-border payments and emerging market economies (e.g., Carter et al., 2024). However, in contrast to traditional instruments that function as money, such as bank deposits and money market fund shares, stablecoins are largely unregulated. In fact, it is still actively debated whether they should be regulated and how (e.g., Jasperse and Hammer, 2024).

In this paper, we study the properties of stablecoins in comparison to money-market mutual funds (MMFs), which are a comparable financial vehicle with well-established money-like properties and a history of regulation of varying efficacy (Financial Stability Board, 2024). We show empirically that stablecoins share important (in)stability properties with MMFs, namely, strong flight-to-safety dynamics—defined as redemptions from entities perceived as riskier accompanied by inflows into those perceived as safer. Given this similarity, the challenges regulators have faced with MMFs foreshadow similar challenges with stablecoins.

Stablecoins and MMFs both engage in liquidity and risk transformation to provide money-like assets to investors. They issue liabilities with a stable nominal value, but the collateral backing these claims is less liquid and can fluctuate in value.<sup>2</sup> This liquidity transformation makes both stablecoins and MMFs vulnerable to runs, similar to banks with uninsured depositors (Rosengren, 2021; Azar et al., 2022; Federal Reserve Board, 2022).<sup>3</sup> We define a run as a wave of redemptions,

<sup>&</sup>lt;sup>1</sup>Throughout this paper, we use the term *crypto assets* to refer to assets held on a blockchain. A blockchain is a distributed computer system that uses cryptography to enable multiple parties to agree on who owns which assets at any given time (Nakamoto, 2008).

<sup>&</sup>lt;sup>2</sup>Algorithmic stablecoins are a special case in which price stability is not ensured by holding collateral, but rather by an algorithmic mechanism that uses arbitrage to balance demand and supply. The liquidity of these stablecoins, rather than depending on collateral liquidity, depends on investor confidence in the pegging algorithm. See Section 2 and Appendix 2.1.3.

<sup>&</sup>lt;sup>3</sup>There are, of course, several differences between MMFs and stablecoins; for example, MMFs are governed by the US Securities and Exchange Commission under Rule 2a-7 of the Investment Company Act of 1940, which sets

often sparked by a loss of confidence in the value of an entity's assets, and exacerbated by a first-mover advantage.<sup>4</sup> It is this vulnerability to runs that fuels the flight-to-safety behavior we observe.

Another similarity between MMFs and stablecoins is that, within each category, there is great heterogeneity in the amount of risk taken by individual funds and coins, respectively. In fact, stablecoins exhibit an even wider range of risk profiles than MMFs. Some stablecoins report that they are backed by safe assets, such as cash and US Treasuries, whose values remain stable or even increase during times of stress. Others, instead, are reportedly backed by riskier collateral, such as corporate bonds or even other crypto assets. As the collateral backing some stablecoins loses value, they are likely to lose their peg, potentially triggering a run. A third group of stablecoins maintain their pegs through algorithms aimed at matching supply and demand; if investors' beliefs about the effectiveness of these algorithms deteriorate, such stablecoins may also suffer runs.

The potential for runs on stablecoins and the stablecoin runs that did occur in 2022 and 2023 have attracted substantial theoretical interest. Several recent works examine the drivers of stablecoin instability and propose self-governance or regulatory solutions to make stablecoins more stable.<sup>5</sup> However, while the various runs suffered by MMFs are well-documented empirically (see references below), with a few exceptions, there is a dearth of empirical evidence on the runs and flight-to-safety dynamics within the stablecoin ecosystem.<sup>6</sup>

minimum portfolio liquidity and maturity standards, among other restrictions, whereas stablecoins are not subject to this regulation. In Section 2, we discuss the institutional differences and similarities between stablecoins and MMFs in detail. Also, while this paper focuses on MMFs and stablecoins, there are other collective investment vehicles with similar structural vulnerabilities, such as private liquidity funds and short-term investment funds (Federal Reserve Board, 2022).

<sup>&</sup>lt;sup>4</sup>This definition is broad enough to encompass episodes as diverse as the Reserve Primary Fund MMF run (Kacperczyk and Schnabl, 2013), the TerraUSD stablecoin run (Liu et al., 2023), and the Silicon Valley Bank run (Drechsler et al., 2024).

<sup>&</sup>lt;sup>5</sup>See, for instance, Arner, Auer and Frost (2020), Bertsch (2023), d'Avernas, Maurin and Vandeweyer (2022), Gorton et al. (2022a), and Li and Mayer (2022).

<sup>&</sup>lt;sup>6</sup>Ma, Zeng and Zhang (2023) structurally estimate the run risk of two major stablecoins. Hoang and Baur (2021) quantify the volatility of stablecoin prices. Oefele, Baur and Smales (2024) shows suggestive evidence of capital flight from riskier to safer stablecoins around the failure of Silicon Valley Bank (SVB) in 2023. Other papers focus on individual runs (Adams and Ibert, 2022; Uhlig, 2022; Liu, Makarov and Schoar, 2023) or examine historical evidence from episodes of runs on financial assets that bear some resemblance to modern stablecoins (Frost, Shin and Wierts, 2020; Gorton, Ross and Ross, 2022b).

We first provide systematic empirical evidence of flight-to-safety dynamics in stablecoins. To this end, we study the response of stablecoin investors to stress events in the broad crypto market associated with large declines in the price of Bitcoin. We find that, during these episodes, investors run from riskier stablecoins to safer ones, a flight-to-safety dynamic similar to what we observe in MMFs in times of stress.<sup>7</sup>

Next, we show that these flight-to-safety dynamics also occur during well-known stablecoin runs. The most significant episode so far was the May 2022 collapse of TerraUSD (UST), an algorithmic stablecoin and the fourth-largest at the time. We show that, following a classic flight-to-safety dynamic, this run had negative spillover effects on other algorithmic stablecoins and stablecoins backed by risky assets, whereas those backed by relatively safer assets experienced net inflows.

Another stablecoin run occurred in March 2023, triggered by the failure of Silicon Valley Bank (SVB). USD Coin (USDC), the second-largest stablecoin at the time, held deposits at SVB. As in the May 2022 run, crypto investors responded quickly to the news by selling or redeeming their USDC tokens. The run spilled over to Dai and Frax, both of which were partially collateralized by USDC. We again show that investor reactions followed a flight-to-safety pattern. However, the flows inverted relative to the May 2022 run because of the different source of risk: investors fled from the formerly safer USDC to other stablecoins based outside the United States and not exposed to SVB, including the formerly riskier USDT.

Overall, these run and flight-to-safety dynamics observed in the stablecoin market are similar to those observed in the MMF industry. During a stress event, MMF investors identify a driver of risk and run away from MMFs that are more exposed to such risk toward relatively safer MMFs or similar vehicles. Indeed, during the Global Financial Crisis in 2008, MMF investors ran from prime funds with larger exposures to Lehman Brothers and asset-backed commercial paper (McCabe, 2010; Kacperczyk and Schnabl, 2013; Duygan-Bump et al., 2013), and toward the

<sup>&</sup>lt;sup>7</sup>Our characterization of a stablecoin as "safe" or "risky" is based on the composition of its underlying collateral (also known as "reserves") *as reported by the stablecoin issuer*. Reporting quality, however, varies across stablecoin issuers, because there is no standardized or regulatory reporting requirement.

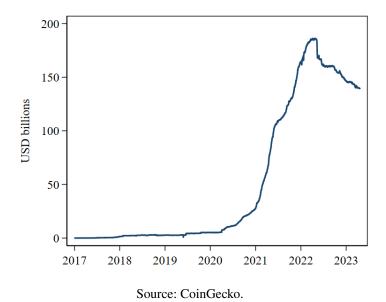
safety of government funds. During the European debt crisis in 2011, investors ran on funds with exposure to European banks (Chernenko and Sunderam, 2014; Ivashina, Scharfstein and Stein, 2015; Gallagher et al., 2020). At the onset of the COVID-19 pandemic in 2020, funds closer to regulatory liquidity constraints experienced heavier outflows (Cipriani and La Spada, 2020; Li et al., 2021). In all these episodes, prime MMFs were exposed to the source of risk and thus suffered outflows, while government MMFs were deemed safer and experienced contemporaneous inflows. Importantly, contagion is a feature of both stablecoin and MMF runs; for instance, Cipriani and La Spada (2020) document information contagion from institutional to retail prime MMFs during the 2020 run.

An additional parallel between MMF and stablecoin investors relates to the pattern of flows. For larger and relatively less risky blockchains, such as Ethereum and Binance Smart Chain, where 90 percent of all stablecoins are traded, we show that flows from riskier to safer stablecoins tend to occur within the same blockchain. This is similar to the pattern of flight-to-safety flows across MMFs, which tend to occur within the same fund complex (Cipriani and La Spada 2020, 2021). By contrast, smaller and riskier blockchains—which represent less than 10 percent of all stablecoin circulation—exhibit a different pattern. Within these blockchains, outflows from riskier stablecoins are correlated with outflows from relatively less risky stablecoins; this suggests that investors deem the blockchains themselves as risky overall and hence depart them for relatively safer (larger) blockchains.

The rest of the paper is organized as follows. Section 2 provides background information on stablecoins and MMFs, and briefly discusses flight-to-safety dynamics. Section 3 describes the data. Section 4 presents our empirical analysis of stablecoin flow dynamics, and Section 5 concludes. Appendix A presents statistics on the largest stablecoins in the industry and describes how they maintain their peg. Appendix B provides additional empirical results supporting our thesis.

Figure 1: Stablecoin industry circulation from January 2017 to April 2023

Alt text: Time series chart showing total stablecoin circulation in billions of U.S. dollars.



# 2 Background

### 2.1 Stablecoins

Stablecoins are crypto assets that seek to maintain a stable price, usually \$1. Over the past several years, stablecoins have experienced extraordinary growth; their market capitalization has increased from \$5 billion in 2019 to about \$125 billion in April 2023 (Figure 1). Currently, stablecoins are predominantly used to facilitate the trading of other, volatile, crypto assets (such as Bitcoin), primarily through trading platforms for digital assets (PWG, 2021). In this capacity, stablecoins serve as private digital currencies of the crypto ecosystem.<sup>8</sup>

There are three main types of stablecoin arrangements: (1) stablecoins backed by traditional financial assets; (2) stablecoins backed by crypto assets; and (3) algorithmic stablecoins. Stablecoins issued by US-based entities have been typically backed by financial assets with little credit

<sup>&</sup>lt;sup>8</sup>In this way, stablecoins are part of a larger class of new media of exchange that also includes central bank digital currencies (CBDCs). The potential effects of CBDCs on payment systems and their participants are studied by, for example, Berg et al. (2023), Di Maggio et al. (2024), and Agur et al. (2022).

<sup>&</sup>lt;sup>9</sup>There is a fourth type of stablecoin, which is backed by commodities; since these stablecoins typically are not pegged to the US dollar, we exclude them from our analysis. Finally, note that stablecoins can also be distinguished by their degree of centralization. Some are issued by a single entity with centralized governance, such as USD Coin

or liquidity risk, such as bank deposits and US Treasury securities (usually with very short maturities to minimize duration risk). By contrast, stablecoins issued by non-US-based (henceforth, "offshore") entities tend to be backed by riskier assets, such as commercial paper or other crypto assets, or by algorithmic mechanisms.<sup>10</sup>

#### 2.1.1 Financial Asset-Backed Stablecoins

Financial asset-backed stablecoins (henceforth, asset-backed stablecoins) represent the largest type of stablecoins, accounting for about 96 percent of the industry market capitalization in December 2022. These stablecoins, which can be issued by entities based in the United States or offshore, are mainly backed by assets that carry little credit or liquidity risk, such as cash, Treasury securities, certificates of deposit, and commercial paper. Their tokens are minted and burned (redeemed) by a centralized entity. Customers may deposit dollars with the issuer and receive stablecoin tokens issued to their public address on the blockchain. Conversely, customers may redeem their tokens by sending them back to the issuer's public address on the blockchain and receiving a dollar credit to their bank account.

The major US-based asset-backed stablecoins include USD Coin (USDC), Binance USD (BUSD), Pax Dollar (USDP), and Gemini Dollar (GUSD). As mentioned above, non-US-based asset-backed stablecoins, like Tether (USDT) and TrueUSD (TUSD), are usually partially backed by riskier assets, such as precious metals or corporate bonds.

#### 2.1.2 Crypto-Backed Stablecoins

Crypto-backed stablecoins are issued by a smart contract and are backed by crypto assets, such as Bitcoin, Ethereum, and even other stablecoins. Their peg is maintained by complex algorithms

and Tether. By contrast, others, such as DAI and the now-defunct TerraUSD, are issued and administered using smart contracts under decentralized governance structures.

<sup>&</sup>lt;sup>10</sup>In 2021, Circle, a US-based entity that co-issues USD Coin (USDC) with Coinbase, announced that it was shifting the composition of USDC's assets to US Treasury obligations and deposits; previously, USDC also had held relatively riskier assets, such as corporate bonds. It is important to note that these stablecoins do not pay interest to their holders, even though the issuers do collect yield from the backing assets. As a result of rising interest rates in recent years, the issuers have been collecting yield that is partially used to overcollateralize their underlying liabilities.

(Kozhan and Viswanath-Natraj, 2021; Lyons and Viswanath-Natraj, 2023). When the collateral is volatile, crypto-backed stablecoins are typically overcollateralized. The most popular crypto-backed stablecoin is Dai (DAI); others include Magic Internet Money (MIM) and Liquity USD (LUSD).

### 2.1.3 Algorithmic Stablecoins

In contrast to asset-backed or crypto-collateralized stablecoins, algorithmic stablecoins are not backed by assets; rather, their peg is maintained by an algorithmic mechanism that dynamically adjusts supply in response to demand fluctuations. The algorithm automatically creates and destroys tokens to stabilize the price. The most popular algorithmic stablecoins work by issuing two tokens: a free-floating cryptocurrency (e.g., Luna) and a stablecoin pegged to the US dollar (e.g., TerraUSD). A smart contract allows users to mint one unit of stablecoin by burning \$1 worth of the free-floating cryptocurrency, and vice versa. For instance, suppose that Luna's price is \$12 and TerraUSD's price drifts down to \$0.90 because of low demand. Then, arbitrageurs can buy 12 TerraUSD tokens for  $$10.80 (= $0.90 \times 12)$ , burn them to obtain one Luna token, and sell it for \$12 for a quick \$1.20 profit. The decreased supply of TerraUSD will bring demand and supply back into balance and hopefully restore the \$1 market price.

Examples of algorithmic stablecoins include TerraUSD (UST), Frax (FRAX), and Decentralized USD (USDD). Some algorithmic stablecoins, such as Frax, are hybrids; that is, their peg is partially maintained through outside collateral and partially through an algorithmic mechanism, which in Frax's case issues a free-floating cryptocurrency called Frax Shares. In Appendix A, we describe these algorithms in more detail.

## 2.2 Money Market Funds

MMFs are open-end mutual funds registered with the Securities and Exchange Commission (SEC) that—like stablecoins—seek to maintain a stable price (or minimal price volatility). There are three types of MMFs: (1) government funds, which invest in cash, Treasury and agency securities, and

repurchase agreements (repos) collateralized by those assets; (2) prime funds, which, in addition, can invest in non-government money market instruments, such as commercial paper and certificates of deposit; and (3) tax-exempt MMFs, which invest primarily in debt instruments issued by municipalities.<sup>11</sup>

In addition to the characteristics of their portfolio holdings, MMFs may be distinguished by their investor type, with institutional MMFs marketed to corporations and fiduciaries, and retail MMFs limited to "natural persons." <sup>12</sup>

As shown in Figure 2, the total net assets (TNA) of publicly offered MMFs have increased significantly over the past few decades, from \$3 trillion in 2008 to \$5.2 trillion at the beginning of 2023. Since October 2016, when the 2014 SEC MMF reform took effect, most of the growth has been driven by government MMFs, which reached \$4 trillion at the beginning of 2023 (80% of the industry).<sup>13</sup>

## 2.3 Stablecoins versus MMFs: Differences and Similarities

There are several notable differences between stablecoins and MMFs. First, MMFs are regulated by the SEC, whereas stablecoins are often not regulated. Second, MMFs are typically sponsored by large banks or fund families, while stablecoins are sponsored by digital asset issuers. Third, the clienteles of stablecoins and MMFs differ: MMF investors include large, traditional, institutional investors, such as financial and nonfinancial corporations, whereas stablecoin investors are mainly either retail investors or crypto-related companies. Fourth, MMFs are backed only by traditional financial assets, while stablecoins are also backed by digital assets or an algorithm.

Finally, as Ma, Zeng and Zhang (2023) and Lyons and Viswanath-Natraj (2023) point out, stablecoins are different from MMF shares in their creation and redemption mechanisms; in this

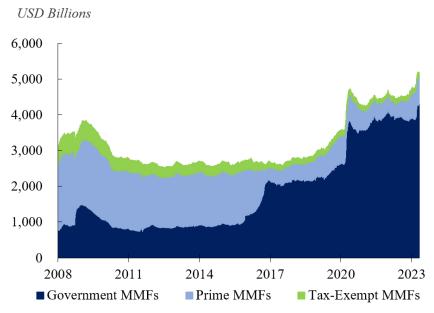
<sup>&</sup>lt;sup>11</sup>MMFs are restricted by regulation to only hold relatively safe assets with short-term maturities.

<sup>&</sup>lt;sup>12</sup>There are also non-public institutional funds, which are not available to the general public.

<sup>&</sup>lt;sup>13</sup>The increase in government fund assets beginning in 2016 was primarily driven by the SEC's 2014 MMF reforms, which had an effective date of October 2016 (Cipriani and La Spada, 2021; Gissler, Macchiavelli and Narajabad, 2021). The increase that began in 2020 was driven by flight-to-safety inflows amid the onset of the COVID-19 pandemic (Cipriani and La Spada, 2020; Anadu and Sanders, 2021).

Figure 2: Assets under management of U.S. MMFs from January 2008 to March 2023

Alt text: Stacked area chart showing total assets of U.S. MMFs in billions U.S. dollars.



Source: iMoneyNet. Data as of March 15, 2023.

Note: The areas in dark blue, light blue, and green represent the assets under management of government, prime, and tax-exempt MMFs, respectively, in billions of US dollars.

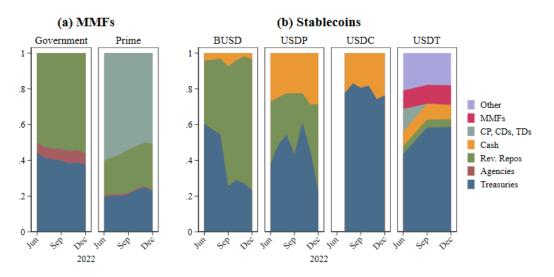
regard, they are closer to exchange-traded funds (ETFs). MMF shares are only traded in the primary market (i.e., they are only bought from and sold to the issuing fund) at their net asset value. In contrast, like ETFs, stablecoins are predominantly traded on the secondary market, with only a restricted set of participants having access to the primary market; for general stablecoin investors, transacting on the secondary market—buying and selling stablecoins on crypto exchanges—is often the only option.<sup>14</sup>

Despite these differences, MMFs serve as a useful benchmark for stablecoins. Among stablecoins backed by traditional financial assets, US-based stablecoins look remarkably similar to government MMFs. Figure 3 shows the composition of MMF and stablecoin portfolios in 2022. Panel (a) shows that about 50 percent of government funds' assets are held in repos, while a little less than 50 percent are held in Treasury securities. Panel (b) of Figure 3 shows that, similar

<sup>&</sup>lt;sup>14</sup>Interestingly, some asset managers have recently launched money market (MM) ETFs, such as BlackRock iShares government and prime MM ETFs, which mix the money-market holdings typical of MMFs with the creation-redemption mechanism of ETFs.

Figure 3: Composition of money market fund and stablecoin asset portfolios in 2022

Alt text: Six stacked-area charts showing the portfolio allocation of two aggregate MMF types (Government and Prime) and four stablecoins (BUSD, USDP, USDC, USDT).



Sources: iMoneyNet and stablecoin issuer attestations.

to government funds, US-based stablecoins (BUSD, USDP, and USDC) are primarily backed by Treasury securities and repos. By contrast, the offshore, asset-backed stablecoin Tether (USDT) is backed by a wider mix of assets that includes commercial paper and certificates of deposit, similar to prime MMFs.

Both MMFs and stablecoins issue money-like liabilities that are vulnerable to runs. Cipriani and La Spada (2021) show that MMF investors demand money-like assets and are willing to pay a premium for greater moneyness, as manifested in the impact of the 2014 SEC MMF reform. This reform, which took effect in October 2016, introduced redemption gates and fees based on portfolio liquidity for all prime funds and a floating net asset value (NAV) for institutional ones. Both changes increased the information sensitivity and therefore decreased the money-likeness of prime funds, resulting in greater differentiation between prime and government MMFs. Government funds, which were unaffected by the reform, were afterwards seen as more money-like than prime funds. Indeed, in the months ahead of October 2016, more than \$1 trillion flowed from prime to government MMFs as the total size of the MMF industry stayed roughly unchanged. In summary,

investors are willing to accept lower net yields in government funds for access to a more money-like product.

Money-like liabilities are a known source of run risk; indeed, MMFs were subject to runs in 2008 and more recently in 2020. Although stablecoins have a redemption mechanism that resembles that of ETFs, Ma et al. (2023) show theoretically that stablecoins are also exposed to run risk. The reason is that, in contrast to what happens in ETFs, stablecoin primary-market participants can create and redeem tokens at a fixed price. When the resources backing the stablecoin are less than the value of tokens in circulation, this creates a first-mover advantage in the primary market. As investors rush to sell their tokens to primary market participants, the first-mover advantage is transmitted to the secondary market.

Given the similarities between stablecoins and MMFs (they are used as a store of value, they have different degrees of risk, and they are exposed to runs), it is important to ascertain whether they also share similar financial stability properties. Section 2.4 discusses the typical features of flight-to-safety episodes in the MMF industry, while Section 4 presents new evidence on the flight-to-safety dynamics within the stablecoin ecosystem.

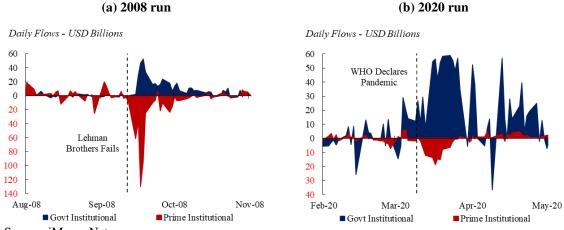
# 2.4 Flights to Safety in MMFs

During episodes of stress in the MMF industry, investors run on the funds more exposed to the source of risk; these have generally been prime funds, which hold unsecured private debt such as bank certificates of deposit. The same investors then typically deposit their cash with government funds, which hold either public debt or secured private debt. These flight-to-safety dynamics in MMFs occurred during the 2008 financial crisis, the 2011 European sovereign debt crisis, and the March 2020 COVID-19 crisis.

In particular, the failure of Lehman Brothers on September 15, 2008, triggered a run on the Reserve Primary Fund, an MMF whose holdings of Lehman Brothers commercial paper had suddenly collapsed in value. Panic soon spread to other institutional prime funds, especially those

Figure 4: MMF flows during periods of stress

Alt text: Two time series charts showing daily aggregate MMF flows in billions U.S. dollars.



Source: iMoneyNet.

Note: Panel (a) shows the total net flows of institutional prime and government MMFs during the 2008 crisis. The dotted black vertical line indicates the beginning of the 2008 run on MMFs when Lehman Brothers failed in September 2008. Likewise, Panel (b) displays the daily net flows of institutional prime and government MMFs during the March 2020 COVID-19 crisis (dashed vertical line).

exposed to other assets that were losing value such as asset-backed commercial paper (McCabe, 2010; Kacperczyk and Schnabl, 2013; Duygan-Bump et al., 2013). Panel (a) of Figure 4 shows the total net flows for government and prime share classes offered to institutional investors during the 2008–2010 period.

The COVID-19 shock triggered another run on prime MMFs in early 2020, as shown in Panel (b) of Figure 4; similarly to 2008, MMFs experienced a sizable industry-wide reallocation from prime to government funds. Over the two-week period ending on March 20, 2020, net outflows from institutional prime funds totaled \$90 billion, 27 percent of these funds' assets at the beginning of March, while net outflows from retail prime funds amounted to \$33 billion, 7 percent of their assets (PWG, 2020). During the same period, government funds experienced significant inflows. Cipriani and La Spada (2020) show that, due to low switching costs, investors ran from prime funds to government funds in the same family.

## 3 Data

We construct a panel of the 12 stablecoins listed in Table 1, using daily data from February 2015 through April 2023 from CoinGecko. For each day-stablecoin observation, we obtain the market capitalization and volume-weighted average price across exchanges in dollars. We calculate each stablecoin's circulation, defined as the number of tokens outstanding, by dividing market capitalization by the price. We then estimate flows as changes in circulation.<sup>15</sup>

Our main sample consists of daily data on the 12 stablecoins reported in Table 1 from January 2021 to March 15, 2023, although individual analyses only use a subset of these data. We further define two "event" samples: January 1, 2022, through the end of the TerraUSD run on May 16, 2022 ("the 2022 sample"), and November 1, 2022, through the end of the USDC run on March 12, 2023 ("the 2023 sample"). To have the same number of stablecoins in each event sample and to ensure that our results are not driven by the behavior of the smallest stablecoins, we use the 10 largest stablecoins at the start of 2022 and 2023, respectively; we report the stablecoins in the two event samples in the last two columns of Table 1. The stablecoins in the 2022 and 2023 samples comprise more than 99 precent of market capitalization at the start of 2022 and 2023, respectively.

In each of the 2022 and 2023 samples, roughly the same number of stablecoins fall into each of four major categories of stablecoins: US-based asset-backed, offshore asset-backed, crypto-backed, and algorithmic stablecoins. In the 2022 panel, three stablecoins are US-based and backed by traditional financial assets (USDC, BUSD, and USDP), two are offshore and backed by traditional financial assets (USDT and TUSD), three are backed by crypto assets (DAI, MIM, and LUSD),

<sup>&</sup>lt;sup>15</sup>CoinGecko reports market capitalization and price. CoinGecko's glossary defines *market capitalization* as the product of the circulating supply of tokens and its current price, and *circulating supply* as the total supply minus any tokens assigned to the token's issuer and affiliates. The practice of assigning tokens to the issuer as a form of "sweat equity" is common among unbacked, free-floating tokens but, to the best of our knowledge, unheard of for stablecoins. We thus expect the difference between market capitalization and circulating supply to be immaterial. See CoinGecko's Methodology and Glossary pages for more information.

<sup>&</sup>lt;sup>16</sup>The 2022 sample includes TerraUSD, whose stabilization algorithm collapsed in 2022. The 2023 sample includes stablecoins that were not in the top 10 in 2022, including a new algorithmic stablecoin (USDD) and an additional US-based stablecoin (GUSD).

Table 1: Stablecoins in our sample by jurisdiction and stabilization mechanism

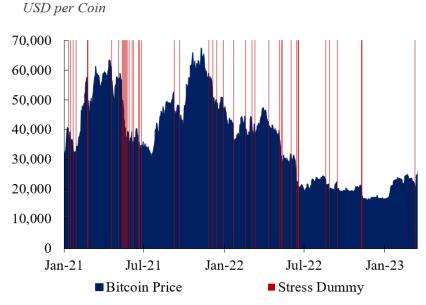
Name	Symbol	US- based	Backing	Market Cap (\$m)	Collateral Type	2022 Sample	2023 Sample
Tether	USDT	N	Assets	73,378	Cash, US Treasuries, Corp. Debt	Y	Y
USD Coin	USDC	Y	Assets	38,426	Cash, US Treasuries, CD	Y	Y
Binance USD	BUSD	Y	Assets	8,381	Cash, US Treasuries	Y	Y
Dai	DAI	N	Crypto assets	6,042		Y	Y
TrueUSD	TUSD	N	Assets	2,032	Cash	Y	Y
Frax	FRAX	N	Algorithm	1,043		Y	Y
Pax Dollar	USDP	Y	Assets	835	Cash and Cash Equiv.	Y	Y
Decentralized USD	USDD	N	Algorithm	721	•	N	Y
Gemini Dollar	GUSD	Y	Assets	387	Cash, Cash Equiv., MMMF	N	Y
Liquity USD	LUSD	N	Crypto assets	257	<b>1</b> /	Y	Y
TerraUSD	UST	N	Algorithm	232		Y	N
Magic Internet Money	MIM	N	Crypto assets	83		Y	N

Sources: CoinGecko. The data are as of March 15, 2023.

Note: This table presents summary statistics for the stablecoins used in the analysis. Market Cap is in millions of US dollars. For stablecoins backed by traditional financial assets, we indicate the types of assets in the Collateral Type column.

Figure 5: Crypto stress measure

Alt text: Time series chart of Bitcoin price in U.S. dollars.



Sources: Authors' computations based on data from CoinGecko. Data as of March 15, 2023. Note: The blue area represents the price of Bitcoin in US dollars. The vertical red lines indicate the stress days ("shocks") identified using the methodology described in the text. The data are daily, and the sample period is January 2021 to March 2023.

and two are algorithmic (UST and FRAX).<sup>17</sup> In the 2023 panel, four stablecoins are US-based and backed by traditional financial assets (USDC, BUSD, USDP, and GUSD), two are offshore and backed by traditional financial assets (USDT and TUSD), two are backed by crypto assets (DAI and LUSD), and two are backed by algorithms (USDD and FRAX).

We also obtain Bitcoin prices over our entire sample period, which we use in some analyses as an indicator of stress in the crypto ecosystem. Specifically, we identify stress days as those in the bottom 5% of the daily return distribution (shown by the vertical red lines in Figure 5.)

Finally, in addition to daily prices and market capitalization from CoinGecko, we also obtain daily data from DefiLlama on the value of stablecoins staked in 10 different blockchains. These data cover the event window of the TerraUSD run, from May 8, 2022, through May 16, 2022, and the window of the USDC run, from March 9, 2023, through March 12, 2023. For three blockchains

<sup>&</sup>lt;sup>17</sup>As described in Appendix A, TUSD used to be US-based until December 2020 but was later sold to an Asian conglomerate.

(Terra, Solana, and Tron), data only begins on May 12, 2022 and thus we exclude these blockchains from the 2022 blockchain-level flow analysis in Section 4.3 below.

# 4 Empirical Analysis

In this section, we provide empirical evidence of flights to safety in stablecoins. The first subsection shows how stress in Bitcoin valuation is followed by stablecoin outflows that vary in intensity for different stablecoin types. The second subsection conducts event studies that quantify the effects of the Terra collapse and the SVB bankruptcy on the stablecoin market. The third subsection analyzes stablecoin flows within blockchains. Each of these stablecoin dynamics has a parallel with the behavior of investor flows in the MMF industry.

## 4.1 Flights to Safety in Stablecoins

In this subsection, we estimate the effect of crypto market shocks on stablecoins. Our shock measure is a dummy variable for stress days in crypto markets, identified as days in the 5th percentile of the distribution of Bitcoin daily price changes over our sample period (see Figure 5). For this analysis, we use our main sample (all twelve stablecoins) over the period starting in January 2021 and ending on March 15, 2023. Prior to the beginning of this period, the market capitalization of all but the major asset-backed stablecoins was negligible.

We use the local projection method (Jordà, 2005) to estimate the response of stablecoin flows to our shock measure. For each horizon h, we estimate the following daily regression using the full panel of stablecoins:

$$\operatorname{Flow}_{i,t-1}^{t+h} = \sum_{n=0}^{2} \operatorname{Shock}_{t-n} \left( \beta_{h,n}^{1} \operatorname{US}_{i} + \beta_{h,n}^{2} \operatorname{Offshore}_{i} + \beta_{h,n}^{3} \operatorname{Crypto}_{i} + \beta_{h,n}^{4} \operatorname{Algo}_{i} \right) +$$

$$+ \sum_{n=1}^{2} \gamma_{h,n} \operatorname{Flow}_{i,t-n-1}^{t-n} + \mu_{h,i} + \varepsilon_{i,t},$$

$$(1)$$

where Flow $_{i,t-1}^{t+h}$  is the cumulative percentage change in the outstanding number of tokens of coin i at t+h relative to t-1, while Flow $_{i,t-n-1}^{t-n}$  is the daily percentage change in the outstanding number of tokens of coin i at t-n relative to t-n-1. Shock $_t$  is an indicator variable that equals 1 if day t is a stress day (as defined in Section 3) and 0 otherwise. US $_t$ , Offshore $_t$ , Crypto $_t$ , and Algo $_t$  are four indicator variables that equal 1 if stablecoin t is, respectively, US-based, offshore asset-backed, backed by crypto assets, and algorithmic (as described in Table 1). B  $\mu_{h,t}$  is the coin fixed effect (which is different for each horizon t; that is, in each regression). We include lagged stablecoin flows to control for serial correlation and possible trends; in Appendix B, we show that information-based selection criteria suggest that the optimal number of lags is two. We run regression (1) for horizons up to eight days after the crypto market shock, that is, t is t in t is t in t

The regression is estimated by weighted least squares using each stablecoin's market capitalization one month prior as the weight so as to give greater weight to the larger stablecoins. We use market capitalization lagged by one month to avoid any mechanical relation between current flows and current weights. Standard errors are clustered at the coin and date levels.<sup>19</sup>

The coefficients  $\beta_{h,0}^1$ ,  $\beta_{h,0}^2$ ,  $\beta_{h,0}^3$ , and  $\beta_{h,0}^4$  estimate the effects of a crypto market shock at time t on the cumulative percentage flows into the different stablecoin types between time t and t + h. In particular, the h = 0 coefficient represents the same-day effect of the shock, that is, the effect of a significant drop in the price of Bitcoin in the last 24 hours on the percentage flows in stablecoins during the same period.

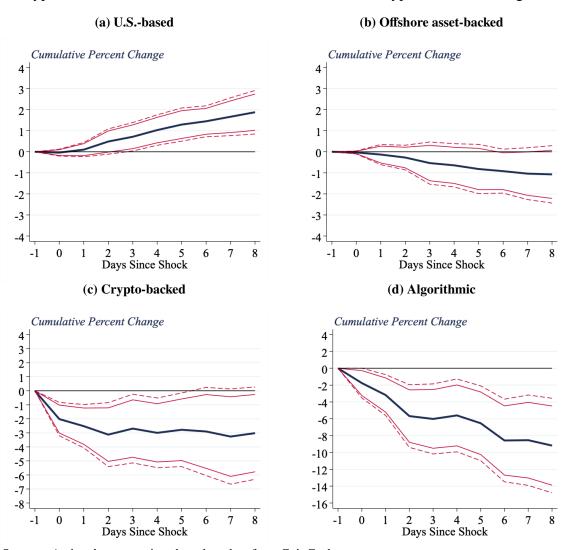
In Figure 6, we plot the response of stablecoins' cumulative percentage flows to our measure of crypto market stress at different horizons and for the four groups of stablecoins described above: US-based ( $\beta_{h,0}^1$ ), offshore asset-backed ( $\beta_{h,0}^2$ ), crypto-backed ( $\beta_{h,0}^3$ ), and algorithmic ( $\beta_{h,0}^4$ ). The corresponding regression estimates are shown in the Appendix (Table B.2). The blue lines represent the point estimates; the solid and dashed red lines represent the 90 percent and 95 percent confidence intervals, respectively.

<sup>&</sup>lt;sup>18</sup>Since these four categories are mutually exclusive and exhaustive,  $US_i + Offshore_i + Crypto_i + Algo_i = 1$ .

<sup>&</sup>lt;sup>19</sup>In Appendix B, we repeat the same analysis using different lag lengths and standard error specifications; the results are similar.

Figure 6: Impulse response functions by stablecoin type

Alt text: Four time-series charts showing the cumulative percent change in stablecoin assets for four different types of stablecoin: U.S.-based, offshore asset-backed, crypto-backed, and algorithmic.



Sources: Authors' computations based on data from CoinGecko.

Note: The blue line represents the estimated impulse response function for investor net flows into a category of stablecoins upon shocks to the price of Bitcoin. The solid and dashed red lines represent the 90 and 95 percent confidence intervals, respectively.

The response of stablecoin flows to crypto market stress depends on collateral type. Following a large decline in the price of Bitcoin, the flows of algorithmic stablecoins have the most negative reaction (Panel (d)), followed by crypto-based stablecoins (Panel (c)), and by a more muted response of offshore asset-backed stablecoins (Panel (b)). Eight days after a shock, the expected excess cumulative flows for these three stablecoin types are -9.2%, -3.0%, and -1.1%. In contrast, the expected cumulative flows of US-based stablecoins (Panel (a)) show a positive reaction of +1.9%, consistent with a flight to safety. The flow difference between US-based stablecoins and others is statistically significant (see Table B.2 in Appendix B). These differential outflows suggest that, following negative shocks to non-stablecoin crypto assets, investors shun riskier stablecoins—those backed either by riskier assets or by algorithms relying, at least in part, on investor confidence—and flee to stablecoins backed by safer assets.

Similar flight-to-safety dynamics are documented in the MMF literature (Bouveret, Martin and McCabe, 2022; Cipriani and La Spada, 2020, 2021). Following stress events, money fund investors run on the more exposed prime funds and flee to the safer government MMFs.

#### 4.2 Event Studies

#### 4.2.1 The 2022 Terra Collapse

In many ways, the May 2022 stablecoin stress episode mirrored the 2008 and 2020 MMF episodes. The run on the algorithmic stablecoin TerraUSD (UST) had strong negative spillovers into the broader offshore stablecoin industry; the only exceptions were US-based stablecoins, which received inflows, similarly to how government MMFs receive inflows when investors run from prime MMFs.

The run began when TerraUSD's algorithmic stabilization mechanism collapsed. As described in Appendix A.4, arbitrage should have pegged the price of TerraUSD at \$1 as long as the price of its sister token, Luna, was above zero, but features of the mechanism left open the possibility for depegging events. In early 2022, asset prices declined, including those of important crypto assets such as Bitcoin, Ethereum, and Luna. At the same time, there was increasing awareness

that Anchor, a protocol offered by the developers of the Terra blockchain, would not be able to keep their promised 20 percent interest rate to TerraUSD depositors.<sup>20</sup> The decreasing value of Luna, combined with the uncertainty about the Anchor protocol's sustainability, led to a loss of confidence in the ability of the TerraUSD algorithm to maintain the US dollar peg and triggered the run on TerraUSD (for additional details, see Liu et al., 2023).

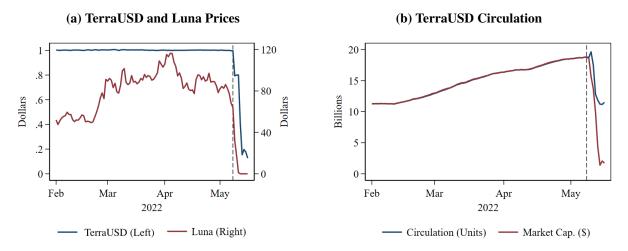
Panel (a) of Figure 7 shows that Luna's price dipped significantly on May 8, 2022, when the token closed at \$64.08. By the next day, Luna's price had halved to \$32.00; by May 12, Luna was trading at \$0.4 cents, or 0.004% of its January 1 value. The same figure shows that TerraUSD's price plummeted following the collapse of Luna: TerraUSD was worth \$0.996 on May 8, \$0.800 on May 9, and only \$0.409 on May 12. After May 17, 2022, the price of TerraUSD never exceeded \$0.10. Importantly, the price of TerraUSD hovered near zero because investors expected the price of Luna to remain at zero; as a result, the algorithmic stability mechanism was broken. Panel (b) shows that the run reversed all of TerraUSD's 2022 growth as circulation returned to January 2022 values, and its market capitalization dropped by about 95 percent.

As with MMF stress episodes, the May 2022 TerraUSD run was characterized by strong negative spillover into the broader stablecoin industry. Panel (a) of Figure 8 shows significant outflows from all offshore stablecoins relative to US-based stablecoins, a pattern reminiscent of runs among prime MMFs. Panel (b) breaks down the results by stablecoin type. It shows that non-US asset-backed, algorithmic, and crypto-collateralized stablecoins experienced outflows in the wake of TerraUSD's collapse, and the effect was strongest for the algorithmic stablecoin Frax, which suffered a 45 percent loss of its May 1 market capitalization by May 16, 2022.

<sup>&</sup>lt;sup>20</sup>The Anchor protocol operator, with the backing of the Terra developers, lent TerraUSD deposits to borrowers, who used them to buy more volatile crypto assets and invest in decentralized finance protocols. Anchor aggregated these higher and more volatile yields and passed them to TerraUSD depositors. The massive growth of TerraUSD in early 2022 was largely due to the interest rates paid by the Anchor protocol; according to decrypt.co, 72 percent of all TerraUSD in circulation was invested in Anchor.

Figure 7: The Terra collapse of 2022

Alt text: Two time-series charts showing the prices of TerraUSD and Luna tokens (left) and TerraUSD circulation (right).

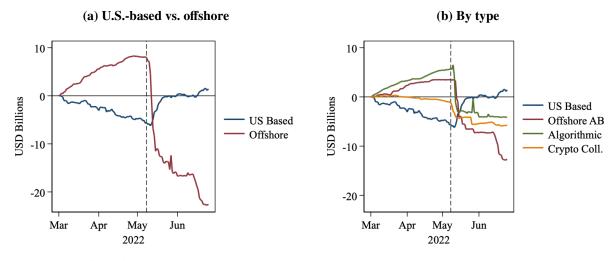


Source: CoinGecko.

Note: The left panel shows daily closing prices for Luna and TerraUSD. The right panel shows the circulation and market capitalization of TerraUSD in 2022. The dashed vertical lines denote May 8, 2022, the first day of the TerraUSD run.

Figure 8: Stablecoin flows around the Terra collapse

Alt text: Two time-series charts showing cumulative changes to stablecoin assets in billions U.S. dollars.



Source: CoinGecko.

Note: Cumulative flows by stablecoin type since March 1, 2022. The dashed vertical line denotes May 8, 2022, the first day of the TerraUSD run. Panel (a) shows all offshore stablecoins combined, while Panel (b) breaks them down by type. "Offshore AB" stands for "Offshore Asset-Backed."

To quantify the outflows suffered by offshore stablecoins relative to their US-based counterparts in May 2022, we run the following regression with daily data:

Flow<sub>i,t-1</sub><sup>t</sup> = 
$$\beta \operatorname{Run}_t \times \operatorname{Offshore}_i + \alpha_i + \gamma_t + \varepsilon_{i,t}$$
, (2)

where Flow $_{i,t-1}^t$  is the daily percentage change in the outstanding number of tokens of coin i at t relative to t-1, Run $_t$  is an indicator variable for the run period (May 8 through May 16, 2022, inclusive), Offshore $_i$  is an indicator variable for non-US-based stablecoins (asset-backed, crypto-backed, or algorithmic),  $\alpha_i$  are stablecoin fixed effects, and  $\gamma_t$  are date fixed effects. Standard errors are Driscoll-Kraay with five lags. The sample is January 1 through May 16, 2022.

Column (1) of Table 2 shows that during the run, the daily percentage change in circulation in offshore asset-backed, crypto-collateralized, and algorithmic stablecoins was 2.3 percentage points lower than the change in circulation in US-based stablecoins. Column (2) breaks down this analysis by category, showing that algorithmic and crypto-collateralized stablecoins were the most affected by the run, with changes in circulation 5.7 and 3.6 percentage points lower, respectively, than those in US-based stablecoins; the impact on offshore asset-backed stablecoins was smaller (1.4 percentage points).

## 4.2.2 The Failure of Silicon Valley Bank and the 2023 Run on USDC

Since 2020, commercial banks have increased their provision of services to crypto industry clients. As stablecoins grew rapidly from early 2020 through 2022, they increased their deposits with some commercial banks. Figure 9 shows the total deposits at three banks serving stablecoins from 2018 through 2022.<sup>21</sup> As shown in the figure, since 2020, these banks' deposits experienced significant growth, along with the market capitalization of stablecoins. If one of these banks were to find itself in trouble, a stablecoin issuer with deposits above the FDIC insurance limit could suddenly be

<sup>&</sup>lt;sup>21</sup>We identify these banks based on the list of banks disclosed in stablecoin issuers' attestations.

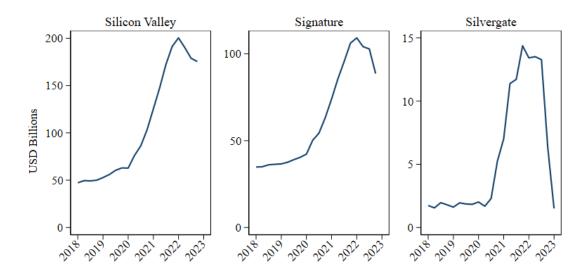
Table 2: Change in circulation during May 2022 run by stablecoin type

	Flows <sub>it</sub> (%)	
	(1)	(2)
$\operatorname{Run}_t \times \operatorname{Offshore}_i$	-2.345** (0.899)	
$\operatorname{Run}_t \times \operatorname{Offshore} \operatorname{Asset} \operatorname{Backed}_i$	(0.022)	-1.392* (0.831)
$\operatorname{Run}_t \times \operatorname{Algorithmic}_i$		-5.719** (2.746)
$Run_t \times Crypto\ Collateralized_i$		-3.602*** (1.176)
Coin FE	Yes	Yes
Date FE	Yes	Yes
Run Definition	5/8/22-5/16/22	5/8/22-5/16/22
Sample	1/1/22-5/16/22	1/1/22-5/16/22
$R^2$	0.24	0.29
Observations	1360	1360

Note: This table reports daily percentage change in circulation regressed on an indicator for the May 2022 run period interacted with stablecoin-type indicators. Run<sub>t</sub> equals 1 on May 8 through May 16, 2022, inclusive. The US-based stablecoins are USDC, BUSD, and USDP; offshore asset-backed stablecoins are USDT and TUSD; crypto-collateralized stablecoins are DAI, MIM, and LUSD; and algorithmic stablecoins are UST and FRAX. Driscoll-Kraay standard errors with five lags are in parentheses. \*\*\*, \*\*, and \* represent 1%, 5%, and 10% statistical significance.

Figure 9: Growth in deposits of banks serving stablecoin issuers

Alt text: Three time-series charts of deposits in billion U.S. dollars for Silicon Valley Bank, Signature, and Silvergate.



Source: Call Reports.

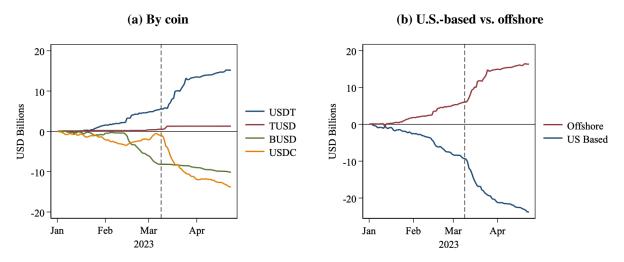
unable to access these deposits and fail to meet its obligations. This would likely trigger a run by its investors.

The stablecoin USDC found itself precisely in this situation when Silicon Valley Bank (SVB) suffered a run on March 9, 2023, and was taken over by the FDIC on March 10; on March 12, the FDIC, with the Department of the Treasury and the Board of Governors of the Federal Reserve System, announced that SVB resolution would fully protect all depositors, including uninsured ones. The run on USDC began on March 9 when investors became concerned about USDC's ability to access the cash it had deposited with SVB. From July 2022 through March 2023, USDC listed publicly that it held part of its cash at SVB. When SVB collapsed, USDC's investors quickly ran. Panel (a) of Figure 10 shows that after March 9, the majority of USDC outflows likely went into USDT and TUSD, two offshore asset-backed stablecoins. Note that other stablecoins in our sample did not have sizable and persistent dollar flows, so we exclude them from the plot.

<sup>&</sup>lt;sup>22</sup>See https://www.federalreserve.gov/newsevents/pressreleases/monetary20230312b.htm.

Figure 10: Stablecoin flows around Silicon Valley Bank failure

Alt text: Two time-series charts showing cumulative changes to stablecoin assets in billions U.S. dollars.



Source: CoinGecko.

Note: This figure depicts cumulative flows since January 1, 2023. Panel (a) shows disaggregated flows by stablecoin, showing only those with significant net flows in March 2023. Panel (b) shows aggregate flows for U.S.-based versus offshore stablecoins. The dashed vertical line is drawn at March 9, 2023, the day SVB was taken over by the FDIC.

The run on USDC was different from the MMF runs of 2008 and 2020, and from the TerraUSD run of 2022, in two ways. First, the run on USDC did not have negative spillovers into stablecoins similar to USDC. Our 2023 sample contains four US-based asset-backed stablecoins: USDC, BUSD, USDP, and GUSD. In March 2023, GUSD and USDP did not have significant dollar flows, and BUSD experienced a noticeable slowdown of previously steady outflows that had begun in mid-February.<sup>23</sup> Although similar to USDC in terms of jurisdiction and broad portfolio composition, BUSD, USDP, and GUSD promptly reported having no exposure to SVB in March 2023.<sup>24</sup>

<sup>&</sup>lt;sup>23</sup>Outflows from BUSD started after its issuer (Paxos) announced that it would stop minting BUSD at the direction of the New York State Department of Financial Services. BUSD lost market capitalization at a rate of about \$350 million per day from February 14 to March 6, 2023; this loss slowed to about \$38 million per day from March 7 to June 5, 2023.

<sup>&</sup>lt;sup>24</sup>For BUSD and USDP, Paxos issued the following statement on Twitter: "Paxos has no relationship with Silicon Valley Bank. For further certainty, Paxos stablecoins have zero exposure to Silicon Valley Bank failure." See https://twitter.com/Paxos/status/1634242623916642304. Similarly, regarding GUSD, Gemini issued the following statement: "@Gemini does not have any banking relationship with Silicon Valley Bank." See https://twitter.com/Gemini/status/1634260777686257664.

The second way in which the 2023 run on USDC distinguished itself from most MMF runs and the 2022 TerraUSD run was that assets fled from a stablecoin that was previously considered among the safest ones to stablecoins that were usually seen as riskier. Panel (b) of Figure 10 shows aggregate cumulative flows from January to April 2023, separately for US-based and offshore stablecoins of all types. The figure shows clearly that as US-based stablecoins suffered outflows during March (mostly attributable to the run on USDC, with some additional outflows from BUSD's ongoing wind-down), offshore stablecoins (asset-backed, crypto-collateralized, and algorithmic) experienced significant inflows.

To quantify the inflows experienced by offshore stablecoins relative to US-based stablecoins during the 2023 run, we again estimate regression (2). Column (1) of Table 3 shows that, compared with US-based stablecoins, the average offshore stablecoin experienced daily inflows larger by 1.3 percentage points from March 9 to March 12 (our definition of the run period). Column (2) separates the analysis by stablecoin type to show that offshore asset-backed, algorithmic, and crypto-collateralized stablecoins all received inflows during the run. The effect on crypto-collateralized stablecoins is especially substantial in the short term because DAI experienced large daily inflows, beginning on March 11. These inflows, however, reversed by the end of March and were small in dollar amounts relative to inflows to the offshore asset-backed stablecoins Tether and TrueUSD (see again Figure 10).<sup>25</sup>

### 4.2.3 Investors' Flight to Safety: MMFs vs. Stablecoin Runs

During periods of crypto market stress, stablecoin investors tend to flee to safety. What constitutes "safety," however, depends on the circumstances. Specifically, whether an asset is considered "safe" depends on the nature of the risk identified by investors as the driver of an adverse event. Following

<sup>&</sup>lt;sup>25</sup>As a robustness check, we extend the run period to the end of March 2023 and show that the coefficients on the offshore asset-backed and algorithmic categories are comparable to those in Table 3. The coefficient on crypto-collateralized stablecoins is positive but no longer significant even at the 10 percent level, indicating that the effect of the run on crypto-collateralized stablecoins was short-lived.

Table 3: Change in circulation during March 2023 run by stablecoin type

	$Flows_{it}(\%)$	
	(1)	(2)
$\operatorname{Run}_t \times \operatorname{Offshore}_i$	1.295**	
	(0.575)	
$Run_t \times Offshore Asset Backed_i$		1.162** (0.508)
$\operatorname{Run}_t \times \operatorname{Algorithmic}_i$		1.163*** (0.410)
$Run_t \times Crypto-Collateralized_i$		3.052** (1.520)
Coin FE	Yes	Yes
Date FE	Yes	Yes
Run Definition	3/9/23-3/12/23	3/9/23-3/12/23
Sample	11/1/22-3/12/23	11/1/22-3/12/23
$R^2$	0.12	0.12
Observations	1320	1320

Note: This table reports daily percentage change in circulation regressed on an indicator for the March 2023 run period interacted with stablecoin types. Run $_t$  equals 1 on March 9 through March 12, 2023, inclusive. The US-based stablecoins are USDC, BUSD, USDP, and GUSD; offshore asset-backed stablecoins are USDT and TUSD; crypto-collateralized stablecoins are DAI and LUSD; and algorithmic stablecoins are USDD and FRAX. Driscoll-Kraay standard errors with 5 lags are in parentheses. \*\*\*, \*\*, and \* represent 1%, 5%, and 10% statistical significance.

a shock, investors run on investment vehicles that are more exposed to the identified risk while at the same time moving funds to the vehicles with less or no exposure to such risk.

This principle explains not only our finding that stablecoin investors flee to US-based stablecoins following crypto market shocks, but also the dynamics of flows to the two largest stablecoins, Tether and USDC, during the 2022 and 2023 stablecoin runs. In the aftermath of the collapse of TerraUSD in May 2022, USDC—the second-largest stablecoin—experienced large net inflows, as investors at that time deemed it the safest stablecoin because it reportedly held Treasury securities and bank deposits, assets generally regarded as safe. By contrast, Tether—the largest stablecoin—experienced net outflows, likely because it held commercial paper and other securities that are generally considered riskier (Figure 8, Panel (b)).

After the failure of SVB in March 2023, however, USDC experienced large net redemptions (Figure 10), and its price dropped to as low as \$0.88.26 These redemptions occurred because \$3.3 billion (about 8 percent) of USDC's assets comprised uninsured deposits held at SVB.27 The uncertainty around the fate of those uninsured deposits rendered some of USDC's assets risky, as they might not have been available to maintain USDC's \$1.00 peg. The chance of nontrivial losses in the USDC portfolio made it rational for USDC holders to run. Tether did not experience a similar shock to its asset portfolio because it did not have cash deposits at SVB or other banks negatively affected by the SVB run. As a result, Tether was the beneficiary of notable flight-to-safety inflows during this episode, and its price rose to \$1.03.

Note, however, that in the MMF industry, flight-to-safety episodes have always seen investors leaving prime MMFs for government MMFs. The reason is that government funds had limited exposure to the risks that triggered the runs on prime funds; in contrast to prime MMFs, government

<sup>&</sup>lt;sup>26</sup>This price reflects secondary market transactions. As explained in Section 2.1.1, in addition to secondary market transactions, some investors may redeem or purchase tokens directly with the stablecoin issuer (that is, through primary market transactions). We are not aware that any USDC tokens were redeemed for less than \$1 in the primary market.

<sup>&</sup>lt;sup>27</sup>These numbers are based on USDC's reported assets of \$42.1 billion as of March 13, 2023. Other assets backing USDC included \$32.4 billion (77 percent of the total) in US Treasury bills, along with \$5.4 billion (13 percent) and \$1 billion in deposits at BNY Mellon and Customers Bank, respectively (Circle, 2023).

MMFs can hold only government debt and repos backed by it, and they cannot impose redemption gates or liquidity fees.

## 4.3 Blockchain-specific Run Dynamics

Cipriani and La Spada (2020) show that, during the 2008 and 2020 crises, outflows from prime MMF investors largely went into government MMFs within the same fund family, possibly due to low switching costs. Panel (a) of Figure 11, for example, shows the scatterplot of cumulative government-MMF inflows against cumulative prime-MMF outflows within the same fund family during the March 2020 crisis, together with a least-squares fit line, indicating a clear positive relationship.

We find a similar behavior during stablecoin stress events. There are no "fund families" in the stablecoin world; there are, however, blockchains, within which stablecoins are traded. It is possible to move stablecoins from one blockchain to another, but doing so may incur transaction fees on both the origin and the destination blockchain. We thus study whether stablecoin flows within blockchains display a pattern similar to MMF flows within fund families during periods of instability. Panel (b) of Figure 11 shows the daily outflows from offshore stablecoins in each blockchain against the daily inflows into US stablecoins within the same blockchain during the 2022 run (that is, each dot represents a US-offshore stablecoin pair on a specific blockchain). Overall, consistent with the pattern observed in MMF families, days of higher outflows from offshore stablecoins are also days of higher inflows into US stablecoins within the same blockchain.

If we examine the dynamics on large and small blockchains separately (Panels (c) and (d) of Figure 11), however, we observe an important difference. For the large blockchains, the pattern is similar to that observed in the aggregate, with outflows from offshore coins corresponding to inflows into US-based coins on the same blockchain. For smaller blockchains, by contrast, we find that days of high outflows from offshore coins are also days of high outflows from US-based coins. This suggests that in May 2022, investors did not switch from offshore to US-based stablecoins

within smaller blockchains, but rather they left these blockchains altogether, consistent with these blockchains being perceived as riskier.<sup>28</sup>

In Table 4, we formally confirm the visual evidence from Figure 11 by regressing daily inflows into US-based stablecoins in large (small) blockchains on outflows to offshore stablecoins in large (small) blockchains, during the 2022 run.<sup>29</sup> The first column shows the results for all blockchains; the second column shows the results for large blockchains—those with stablecoin circulations \$10 billion or greater; the third shows results for small blockchains—with circulations less than \$10 billion. These results corroborate the patterns observed above: Investors shift from offshore to US stablecoins on larger blockchains, whereas they flee both stablecoin types on smaller blockchains. Specifically, during the 2022 run, a \$1 outflow from offshore stablecoins corresponds to a \$0.42 inflow in US-based stablecoins within large blockchains; on smaller blockchains, a \$1 outflow from offshore stablecoins corresponds to a \$1 outflow from US ones.<sup>30</sup>

In Figure 12 and Table 5, we repeat our blockchain-level analysis for the March 2023 run, when investors left US stablecoins for offshore ones. Panel (a) of Figure 12 shows that, during March 9 through 12, 2023, days of higher outflows from US stablecoins are also days of higher inflows into offshore stablecoins within each of the large blockchains. Panel (b) shows that, by contrast, higher outflows from US stablecoins are associated with higher outflows from US stablecoins on small blockchains, although the effect is less pronounced than during the 2022 run. Table 5 tests both of these observations formally. Within large blockchains, a \$1 outflow from stressed US stablecoins corresponds to a \$0.22 inflow in offshore stablecoins during the 2023 run. Within small blockchains, instead, the effect is negative and insignificant.

<sup>&</sup>lt;sup>28</sup>In proof-of-stake blockchains, a user is selected as a transaction validator with a probability proportional to the share of the native token held by that user. All else being equal, smaller proof-of-stake chains are less secure because it would be easier for an adversary to gain control of a large amount of stake and manipulate transactions in their favor via double spending attacks.

<sup>&</sup>lt;sup>29</sup> As discussed in Section 3, this analysis is limited to the seven blockchains for which DefiLlama has data throughout the run period.

<sup>&</sup>lt;sup>30</sup>The quantitative estimates also indicate that, despite the within-blockchain substitution, there was on net outflows even from the large chains during the 2022 run.

Table 4: Relation between offshore and U.S.-based stablecoin flows during May 2022.

	(1)	(2)	(3)
		US-Based Inflows	S
Offshore Outflows	0.408***	0.416**	-1.174**
	(3.58)	(3.64)	(-2.78)
Constant	-0.015	-0.015	0.006
	(-1.46)	(-0.44)	(1.23)
Blockchain Size	All	Large	Small
Sample (2022 Run)	5/8/22-5/16/22	5/8/22-5/16/22	5/8/22-5/16/22
N	63	18	45
$R^2$	0.600	0.616	0.536

Note: This table reports the coefficients from regressing aggregate inflows into US-based stablecoins on aggregate outflows from offshore stablecoins during the May 2022 run for the subset of blockchains covered by DefiLlama during all days of the run. This excludes Terra, Solana, and Tron, for which DefiLlama only provides data starting on May 12, 2022. The three columns show the results, respectively, of aggregate flows across all 7 blockchains in the sample, large blockchains—with a circulation \$10 billion or greater (Ethereum and Binance Smart Chain), and small blockchains—with a circulation below \$10 billion (Arbitrum, Avalanche, Fantom, Optimism, and Polygon). t-statistics, based on standard errors robust to heteroskedasticity, are in parentheses. \*\*\*, \*\*, and \* represent 1%, 5%, and 10% statistical significance.

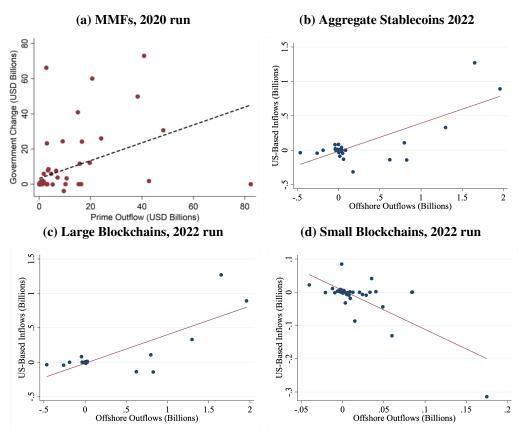
Table 5: Relation between offshore and U.S.-based stablecoin flows during March 2023.

	(1)	(2)	(3)
		Offshore Inflows	
US-Based Outflows	0.237***	0.218***	-0.038
	(15.01)	(10.76)	(-0.93)
Constant	0.011	0.055	-0.001
	(1.02)	(1.41)	(-0.88)
Blockchain Size	All	Large	Small
Sample (2023 Run)	3/9/23-3/12/23	3/9/23-3/12/23	3/9/23-3/12/23
N	40	12	28
$R^2$	0.702	0.684	0.036

Note: This table shows the results from regressing aggregate outflows from US-based stablecoins on aggregate inflows into offshore stablecoins during the March 2023 run using data from DefiLlama. The three columns show the results, respectively, of aggregate flows across all 10 blockchains, large blockchains (Ethereum, Tron, and Binance Smart Chain), and small blockchains (Arbitrum, Avalanche, Fantom, Optimism, Polygon, Solana, and Terra). t-statistics, based on standard errors robust to heteroskedasticity, are in parentheses. \*\*\*, \*\*, and \* represent 1%, 5%, and 10% statistical significance.

Figure 11: Run dynamics: Flows from offshore to U.S.-based stablecoins vs. flows from prime to government MMFs

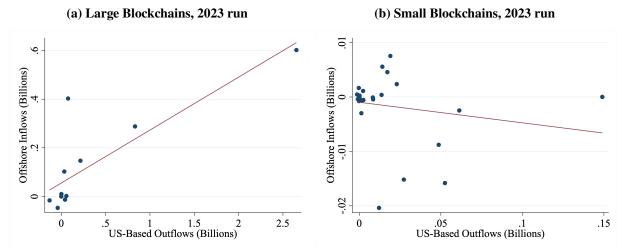
Alt text: four scatterplots with regression lines showing the correlation between flows to different types of MMFs or stablecoins.



Note: Panel (a) shows intra-family flows among MMFs in March 2020, Panel (b) shows daily aggregate intra-industry stablecoin flows over the May 8–16, 2022, period and Panels (c) and (d) show daily intra-blockchain stablecoin flows on large and small blockchains, respectively, over the May 8–16, 2022, period. Large blockchains are Ethereum and Binance Smart Chain (BSC). Small blockchains are Arbitrum, Avalanche, Fantom, Optimism, and Polygon. Source: DefiLlama.

Figure 12: Flows from offshore to U.S.-based stablecoins during March 2023

Alt text: two scatterplots with regression lines showing the correlation between flows to different types of stablecoins.



Note: Daily intra-blockchain stablecoin flows on large and small blockchains, respectively, over the March 9–12, 2023, period. Large blockchains are Ethereum, Binance Smart Chain (BSC), and Tron. Small blockchains are Arbitrum, Avalanche, Fantom, Optimism, Polygon, Solana, Terra. Source: DefiLlama.

## 5 Conclusion

While flight-to-safety dynamics in money market funds have been extensively documented in the literature—with money flowing from the riskier prime segment of the industry to the safer government segment—much less is known about the extent to which such dynamics are also at play among stablecoins. In this paper, we bridge this gap by showing that flight-to-safety dynamics in stablecoins resemble those in the MMF industry. During periods of stress in crypto markets, safer stablecoins experience net inflows, while riskier ones suffer net outflows. This pattern is present not only on average, but also during specific periods of acute market stress, such as the 2022 run on TerraUSD, which spilled over into similarly risky stablecoins, and the 2023 collapse of Silicon Valley Bank, which spilled over into stablecoins exposed to the failing bank.

We also show that flight-to-safety flows across stablecoins tend to occur within the same blockchain, similarly to how flight-to-safety flows across MMFs occur within the same fund family. This resemblance, however, is absent among small blockchains, which generally suffered overall outflows during stress episodes as investors seemed to deem the entire chains as more risky.

Our findings demonstrate that stablecoins are vulnerable to runs during periods of broad crypto market dislocation as well as idiosyncratic stress events. Should stablecoins continue to grow and become more interconnected with mainstream financial markets, such as short-term funding markets, they could become a source of financial instability for the broader financial system.

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# A Appendix: Stability Mechanisms

In this section, we describe the stablecoins that comprise our data and explain the mechanisms through which most stablecoins maintain their peg. Because of the permissionless nature of blockchain technology, there have been many different attempts to create stablecoins, with varying degrees of success. Our data set contains stablecoin data on 12 stablecoins, which we describe roughly in order of highest to lowest average market capitalization in early 2022, before the TerraUSD crash. Taken together, BUSD, USDC, USDP, USDT, TUSD, FRAX, USTC, DAI, LUSD, and MIM comprised more than 99 percent of the total market capitalization in early 2022. BUSD, USDC, USDP, GUSD, USDT, TUSD, USDD, FRAX, DAI, and LUSD comprised more than 99 percent of the total market capitalization in early 2023.<sup>31</sup>

#### A.1 Tether (USDT)

Tether was launched in 2014 by a Hong Kong-based company called iFinex, which is also the owner of Bitfinex, a large crypto exchange. At launch, Tether promised that each unit of stablecoin issued would be backed by \$1 held in a bank account. Tether has revised the specifics of this promise several times starting in 2019; Figure A.1 shows that Tether claimed it was backed by traditional currency in February 2019 but by April 2019 changed its disclosure to state that Tether is backed by a mixture of assets.

Table A.1 shows Tether's assets according to its May 2022 attestation.<sup>32</sup> In March 2022, Tether had \$82.26 billion in liabilities and \$82.42 billion worth of assets. The assets were \$20.1 billion of commercial paper, \$39.2 billion of Treasury securities, \$6.8 billion of money market funds shares, \$3.1 billion of secured loans, \$3.7 billion worth of corporate bonds, mutual funds and precious metals, and \$4.9 billion worth of other investments, including other crypto assets.

<sup>&</sup>lt;sup>31</sup>These are the same 10 stablecoins as in the 2022 analysis, except USTC and MIM were overtaken by GUSD and USDD when ranking stablecoins by market capitalization.

<sup>32</sup>https://assets.ctfassets.net/vyse88cgwfbl/1np5dpcwuHrWJ4AgUgI3Vn/
07fcaeb1cd7ce6df71ce8f5abb09ddb7/Tether\_Assurance\_Consolidated\_Reserves\_Report\_
2022-03-31\_\_1.pdf

Figure A.1: Comparison of Tether disclosures from February 2019 and April 2019

Alt text: Two screenshots from Tether disclosures.



100% Backed

Every tether is always backed 1-to-1, by traditional currency held in our reserves. So 1 USD₹ is always equivalent to 1 USD.



100% Backed

Every tether is always 100% backed by our reserves, which include traditional currency and cash equivalents and, from time to time, may include other assets and receivables from loans made by Tether to third parties, which may include affiliated entities (collectively, "reserves"), Every tether is also 1-to-1 pegged to the dollar, so 1 USD F is always valued by Tether at 1

(a) Tether disclosure from February 2019

**(b)** Tether disclosure from April 2019

Source: Internet Archive snapshots of Tether homepage (February; April).

Note: The disclosure from February 2019 asserts that every Tether is backed by traditional currency, while the disclosure from April 2019 states that Tether is backed by a mixture of assets.

On many occasions, Tether has traded below its one-to-one peg with the dollar, but it has always recovered to parity. Nevertheless, because it is backed by risky assets and lacks transparency, Tether is perceived as subject to a large degree of run risk.

#### **USD Coin (USDC) A.2**

USD Coin (USDC) was launched in 2018 by Circle, a company based in Massachusetts. It is operated by a consortium of companies called Centre, which includes Circle and Coinbase. Like Tether, USDC maintains its peg by backing its coin with financial assets; but unlike Tether, it invests mainly in safe government assets. For instance, according to USDC's attestation reports,<sup>33</sup> in July 2022, there were 54.6 billion USDC units in circulation, backed by \$54.7 billion of assets, 22.4 percent held in cash and 77.6 percent held in short-term Treasury securities. USDC has money transmitter licenses in multiple US states and the District of Columbia, and regularly publishes attestations of their assets.

<sup>33</sup> https://www.circle.com/en/transparency

Table A.1: Tether balance sheet according to its May 2022 attestation

Asset Type	Billions of Dollars	Share of Assets (%)
Commercial Paper	20.1	24.4
US Treasuries	39.2	47.6
Money Market Funds	6.8	8.3
Secured Loans	3.1	3.8
Corporate Bonds, Funds and Precious Metals	3.7	4.5
Other Investments, Including Cryptocurrencies	4.9	5.9
Total Assets	82.42	
Total Liabilities	82.26	

Even though USDC is backed by cash and short-term Treasury securities, it is still runnable. In particular, its liabilities are not eligible for FDIC insurance; therefore, a run on USDC does not necessarily have the usual dampeners as an analogous run on a US bank. This proved to be the case in March 2023, when investors ran on USDC after observing that 8 percent of the stablecoin's assets were at risk in the Silicon Valley Bank collapse. Within hours, USDC's price crashed to \$0.88, and its market capitalization declined by \$7.9 billion, 18 percent of its market capitalization at the beginning of the day. <sup>34</sup> Only after regulators extended protection beyond the \$250,000 cap on FDIC deposit insurance did market participants regain enough confidence in USDC for the stablecoin to regain its peg.

## A.3 Binance USD (BUSD)

The third-largest stablecoin in 2022 was Binance USD (BUSD), issued by a company called Paxos, which is based in New York State and therefore regulated by the New York Department of Financial Services (NYDFS). As of February 21, 2023, Paxos stopped issuing BUSD at NYDFS's direction. According to the Paxos website, 35 BUSD can still be redeemed for USD or exchanged for USDP,

<sup>&</sup>lt;sup>34</sup>This price reflects secondary market transactions. As explained earlier, in addition to secondary market transactions, some investors may redeem or purchase tokens directly with the SC issuer (that is, primary market transactions.) We do not know if any UDSC tokens were redeemed for less than \$1 in the primary market during this time.

<sup>35</sup>https://paxos.com/2023/02/13/paxos-will-halt-minting-new-busd-tokens/

another stablecoin issued by Paxos, and Paxos will fully collateralize BUSD with safe assets such as cash, US Treasury bills, and overnight reverse repos indefinitely.

### A.4 TerraUSD (UST)

TerraUSD (UST) is an algorithmic stablecoin and was the fourth-largest stablecoin up to May 2022, when it suffered a run. In contrast to asset-backed or crypto-collateralized stablecoins, algorithmic stablecoins are not backed by a financial asset. Rather, their peg is maintained through an algorithmic mechanism.

In the TerraUSD stablecoin mechanism, there are two tokens: TerraUSD, which is designed to be stable, and Luna, a crypto asset similar to Bitcoin whose value fluctuates over time but which, in contrast to Bitcoin, can be minted in an unlimited amount. Any investors with a node in the Terra blockchain has access to a smart contract, which allows them to create or redeem one unit of TerraUSD for \$1 worth of Luna; for instance, if the price of Luna is \$10, the smart contract will exchange one TerraUSD for 0.1 unit of Luna. Arbitrage should keep the value of TerraUSD stable at \$1 as long as the price of Luna is greater than \$0.

There are several reasons why such a system may be unstable, including:

- 1. Limits to Arbitrage: There are costs to running a node on the Terra blockchain, and not every investor runs a node.
- 2. Positive Feedback Loop: As the price of Luna decreases, any redemption of TerraUSD will increase the supply of Luna by larger and larger amounts. For instance, if Luna trades at \$0.01, then redeeming one unit of TerraUSD will create 100 units of Luna. As TerraUSD crashed, the supply of LUNA increased from 365 million units on May 9 to more than 6 trillion units by May 13.
- 3. Multiple Equilibria: The mechanism for stabilizing TerraUSD's price has two equilibria: If investors believe Luna will trade for a positive price, then TerraUSD will trade for \$1; but if investors expect the price of Luna to be \$0, then the price of TerraUSD will also be \$0.

Indeed, the limits of the TerraUSD algorithm became apparent in May 2022, when the price of both TerraUSD and Luna crashed close to \$0.

#### A.5 Dai (DAI)

DAI is issued by MakerDAO, a so-called distributed autonomous organization (DAO) established in 2014. MakerDAO launched two tokens, DAI and Maker (MKR), in 2017 on the Ethereum blockchain. The MKR token is a governance token, with MKR holders able to vote on the parameters that determine the behavior of the DAI stablecoin; investors can buy and sell MKR in an exchange. That is, MakerDAO is similar to a company with no board of directors whose decisions are made directly by equity holders (that is, the holders of MKR).

The DAI token is a crypto-collateralized stablecoin. New units of DAI are minted and redeemed through smart contracts called vaults. A user can mint new DAI by creating a vault and depositing collateral in it. There are several types of vaults, each specifying the minimum collateral needed to issue a unit of DAI. Each type of vault is established through a vote by MKR owners. The collateral can be Ethereum, Bitcoin, other crypto assets including stablecoins, and increasingly "real world assets" such as tokenized mortgages.

For instance, a user who creates a vault of type ETH-A would deposit at least \$145 worth of Ethereum and generate 100 units of DAI. If the peg holds so that 1 DAI is worth \$1 on secondary markets, then this would generate \$100 worth of DAI. The user can use the DAI they minted to invest in crypto assets or DF protocols on the Ethereum blockchain. Note that although DAI can be created through different vault type, once created, they are all fungible and can be traded freely on secondary markets.

A user who mints DAI has effectively borrowed it from the system through a collateralized loan. To recover their collateral, the user needs to repay the DAI back to the vault smart contract, together with an interest rate, also specified for each vault type by the holders of MKR. As we will see below, the proceeds from this interest rate contribute to a stability buffer.

When DAI is backed by volatile assets, it is usually overcollateralized. If the value of the collateral drops below the minimum collateral specified by the vault type (\$145 worth of Ethereum for \$100 worth of DAI in the previous example), then the collateral can be liquidated via an auction. Any holder of DAI can start the auction and would get a fee for doing so. The winner of the auction would receive the collateral in exchange for their DAI holdings. The user who deposited the collateral would need to deposit more Ethereum to avoid the liquidation. As long as the collateral value in each vault is above 100 percent, then the peg of DAI will be maintained because any DAI holder is better off participating in the auctions than selling DAI at a price below \$1.

DAI's smart contract has the following properties:

- Issuance: Any user can send collateral (in the form of Bitcoin, Ethereum, or other allowed assets) and receive newly minted units of DAI at the price of \$1. The collateral gets cryptographically locked by the smart contract into a vault, which is associated with the user who minted the DAI.
- Use: A user who has minted DAI can proceed to use it to buy other crypto assets or loan the DAI in a decentralized finance protocol and earn higher yield. A popular use case is using DAI to take a leveraged position on ETH. For instance, a user may use \$150 worth of ETH collateral to mint \$100 worth of DAI. Then, the user proceeds to buy \$100 worth of ETH with their newly minted DAI. This gives the user a \$250 position on ETH using an initial capital of \$150, amplifying returns by a factor of  $\frac{5}{3}$ . Users can repeat this cycle to amplify their total returns by a factor of 3.
- Redemption: Conversely, any user who had minted DAI can redeem it by returning their units
  and receiving back the collateral minus a redemption fee. It is important to note that only the
  user who minted the DAI associated with a particular vault can redeem the collateral in that
  vault.
- Liquidation: If the value of the collateral in a vault drops below a certain threshold, then any user can trigger an auction. Any DAI holder can bid in the auction for the collateral. All

bids are denominated in DAI; the winning bidder obtains the assets backing DAI, and the equivalent amount of stablecoins is destroyed.

Note that the mechanism outlined above allows an arbitrageur to profit if DAI trades outside the  $\left[\frac{1}{1.45}, 1.45\right]$  interval. If DAI traded above \$1.45, then a user could buy \$1.45 worth of Ethereum, use it as collateral to generate one unit of DAI, and sell the DAI for more than \$1.45, obtaining a riskless profit. If DAI traded below  $\frac{1}{1.45}$ , then the arbitrageur could short one unit of DAI, buy \$ $\frac{1}{1.45}$  worth of Ethereum, and use it to generate one unit of DAI to repay their short. While the parameters in this specific example does not guarantee a very tight peg, there are alternative mechanisms that keep the peg in a much more narrow band.

- Savings Rate: DAI provides a DAI savings rate—essentially a deposit rate—which can be raised when the price of DAI is low and lowered when the price of DAI is high.
- Stability Fees: Users who mint DAI will continuously pay a stability fee—essentially a borrowing rate—until they redeem their DAI. When the stability fee is high, it incentivizes users to redeem their DAI and take stablecoins out of circulation, increasing the price of DAI. Conversely, lower stability fees encourage the creation of new DAI, reducing the price.
- Multiple Types of Collateral: In addition to the earlier Ethereum example, there are other types
  of collateral with different collateralization ratios. Many of these other types of collateral
  are asset-backed stablecoins, with collateralization ratios around 100 percent, allowing for
  a tighter peg. Note that this implies that DAI's peg is linked to the stability of asset-backed
  stablecoins.
- Besides all these mechanisms, DAI also has a peg stability module, which allows users to
  exchange DAI for USD Coin at a 1:1 ratio—without locking any collateral. This is in addition
  to using other asset-backed stablecoins like Paxos as collateral. Thus, the value of DAI is
  intrinsically linked to the value of USD Coin and other US-based stablecoins.

### A.6 Magic Internet Money (MIM)

Magic Internet Money (MIM) is a crypto-collateralized stablecoin that uses interest-bearing crypto-asset derivatives as collateral. It was launched in 2021 and operates on the Ethereum blockchain. Like DAI, MIM is crypto-collateralized: Any user can mint new MIM by depositing collateral in a smart contract called a cauldron and can redeem MIM by returning it to the smart contract and reclaiming the collateral. The parameters governing the behavior of cauldrons are determined using a governance token called SPELL, which is analogous to MakerDAO's MKR.

In contrast to DAI, where most of the crypto-collateral used is a standard crypto asset like ETH, most of the crypto-collateral in the MIM protocol is in the form of interest-yielding tokens issued by other decentralized finance protocols. In this way, MIM adds another layer of complexity and potential instability to the decentralized finance ecosystem.

#### A.7 TrueUSD (TUSD)

TrueUSD is an asset-backed stablecoin originally issued by TrustToken, a company based in San Francisco, and whose reserves were stored in the United States.<sup>36</sup> In 2020, the TUSD brand was sold to Techteryx, an Asian conglomerate based in China<sup>37</sup>. After this transfer, the collateral was held at a variety of banks, including in the United States, the Bahamas, and Hong Kong, making TUSD transition from US-based to Offshore.<sup>38</sup>

### A.8 Frax (FRAX)

Frax was launched in 2020 and follows a hybrid design. In its original incarnation—Version 1—Frax was partially collateralized by USDC and partially collateralized by Frax Shares (FXS), a

<sup>&</sup>lt;sup>36</sup>In an attestation from 2018 (https://trusttokenteam.medium.com/nov30-b4261325c468), the issuing company attests that the collateral funds are held by two escrow agents in the United States.

<sup>&</sup>lt;sup>37</sup>https://trueusd.medium.com/scaling-trust-announcing-tusds-next-stage-of-growth-f1fb58d62b

<sup>38</sup>https://trueusd.medium.com/trueusd-attestations-49092b7cb500

free-floating token like LUNA. Version 2 is collateralized by a wider variety of assets, including tokens representing ownership shares of decentralized exchange contracts where FRAX is traded.

**Frax Version 1.** The key state variable in FRAX Version 1 is the collateral ratio  $\rho \in [0, 1]$ . Given a collateral ratio of  $\rho$ , a unit of FRAX can be minted by depositing  $\rho$  units of USDC and  $(1 - \rho)$  dollars worth of FXS into a smart contract. In the other direction, a user can redeem a unit of FRAX via this smart contract and receive  $\rho$  units of USDC and  $(1 - \rho)$  units of FXS. The collateral ratio can be increased or decreased if certain conditions are met. For example, if FRAX is trading above \$1, then the collateral ratio can be decreased so that less USDC collateral is needed to mint one unit of FRAX. If FRAX is trading below \$1, then the collateral ratio can be increased. This makes it more difficult to mint new units of FRAX and increases the incentive to redeem existing units (by providing more USDC when FRAX units are redeemed). These collateral changes can be triggered by any user who calls the corresponding functions in the FRAX smart contract. However, these functions can only be called if the corresponding price conditions (FRAX above \$1 or FRAX below \$1) are met.

**FRAX Version 2.** The main distinction between FRAX Version 1 and Version 2 is that Version 2 relies on a wide array of crypto assets as the backing collateral. However, there are other important distinctions that increase its interconnections with the rest of the crypto ecosystem:

- Since multiple tokens can be used as collateral, it is possible that the value of the collateral
  is above or below 100 percent. If the value of collateral is above 100 percent, there is a
  function in the smart contract—called FXS 1559—allowing some FXS units to be redeemed
  for collateral.
- 2. The protocol rehypothecates some of the USDC collateral by investing it in decentralized finance protocols such as Aave, Compound, and Yearn.
- 3. The protocol also rehypothecates USDC collateral by placing it in the Curve or Uniswap decentralized exchanges.

4. New FRAX can be minted by borrowing it using collateral, in a similar way that DAI is minted.

#### A.9 Pax Dollar (USDP)

Paxos issues another stablecoin, Pax Dollar (USDP), which was the ninth-largest stablecoin in April 2022. Like BUSD, USDP is backed by cash, US Treasury bills, and overnight reverse repos.

#### A.10 Liquity USD (LUSD)

Liquity USD (LUSD) is another crypto-collateralized stablecoin that operates on the Ethereum platform. In contrast with DAI and MIM, LUSD smart contracts only accept Ethereum as collateral and do not charge an interest rate. Instead, there is a one-time fee at the time of borrowing. The collateral ratio needed to generate LUSD is 110 percent.

### A.11 Gemini Dollar (GUSD)

Like BUSD, Gemini Dollar (GUSD) is an exchange-branded token that is issued and custodied by Paxos. Like BUSD and USDP, the funds used to back GUSD are custodied in US financial institutions.

# A.12 Decentralized USD (USDD)

USDD is an algorithmic stablecoin backed by several tokens, including Tron (TRX), USDT, and USDC. USDD trades on the TRON blockchain and was introduced in May 2022. Like FRAX, USDD is a hybrid stablecoin. It has an algorithmic mechanism that allows users to exchange one unit of USDD for \$1 worth of TRX at any time. In addition, it is backed by a peg stability module (PSM) holding reserves of USDT and USDC, allowing users to exchange one unit of USDD for one unit of USDT or USDC.

USDD has broken its peg multiple times, including in May and June 2022, and March 2023, but has recovered its peg since then.

# **B** Appendix: Regression Tables

### **B.1** Local projections: regression results and robustness checks

Table B.2 reports the coefficient estimates corresponding to the plots in Figure 6. The bottom six rows of Table B.2 report the p-values from F tests for the difference across the coefficients. For instance, in the "h=1" column, the p-value for "US  $\neq$  Algo" is 0.032, indicating that the difference in net flows between US-based stablecoins and algorithmic stablecoins one day after a Bitcoin price shock is significant at the 5 percent level. These test results, taken together with the divergent sign of the point estimates (positive flows for US-based stablecoins and negative for the rest), indicate that the flows to U.S.-based stablecoins are qualitatively and significantly different.

In addition to our main specification reported in Table B.2, we run a number of robustness checks. The first one concerns the number of lags, which are included to control for serial correlation in both the dependent and independent variables. To choose the optimal number of lags, we follow a procedure suggested in Jordà (2005) and Montiel Olea and Plagborg-Møller (2021). We run a vector autoregression (VAR) for the  $[Flow_{i,t}, Shock_{i,t}]$  vector for each stablecoin i. We estimate the VAR with  $p = \{1, 2, 3, ..., 31\}$  lags (to allow for monthly seasonality) and choose the optimal number of lags based on an information criterion (IC). We use the Akaike IC (AIC), and the Bayesian IC (BIC), which in practice agree for every stablecoin. For nine out of twelve stablecoins, the IC indicates two lags as the optimal number. We choose this as our main specification under the parsimonious assumption that the optimal lag length for all stablecoins is the same.

For the other three stablecoins, the IC points to much longer lags (14, 30, and 30). Furthermore, Montiel Olea and Plagborg-Møller (2021) suggest that the VAR lag length p should be chosen "conservatively ... there is no asymptotic efficiency cost of controlling for more than  $p_0$  lags if the

Table B.2: Local projection estimates of stablecoin cumulative flow on Bitcoin shock (value-weighted)

	I	Dependent Variable:	Variable:		ve Percen	t Outflow	Cumulative Percent Outflows h Days After Shock	fter Shock	
	h = 0	h = 1	h = 2	<i>h</i> = 3	h = 4	h = 5	h = 6	h = 7	<i>h</i> = 8
US-Based	-0.04	0.10	0.49	0.71*	1.03**	1.29***	1.45***	1.67***	1.88***
	(-0.46)	(0.60)	(1.59)	(2.07)	(2.80)	(3.21)	(3.87)	(3.63)	(3.57)
Offshore	-0.03	-0.13	-0.27	-0.54	-0.64	-0.82	-0.92	-1.04	-1.07
	(-0.85)	(-0.54)	(-0.91)	(-1.05)	(-1.23)	(-1.37)	(-1.73)	(-1.65)	(-1.54)
Algorithmic	-1.76*	-3.18**	-5.68**	-6.02**	-5.60**	-6.53**	-8.58***	-8.54***	-9.18***
	(-1.95)	(-2.57)	(-2.99)	(-2.83)	(-2.54)	(-2.88)	(-3.42)	(-3.12)	(-3.20)
Crypto-Collateralized	-2.02***	-2.52***	-3.13**	-2.70*	-3.00**	-2.78*	-2.90*	-3.27*	-3.02*
	(-3.33)	(-3.20)	(-2.69)	(-2.16)	(-2.37)	(-2.08)	(-1.81)	(-1.89)	(-1.80)
Coin FE	Y	Y	Y	Y	Y	Y	Y	Y	Y
N. Obs.	8,676	8,676	8,676	8,676	8,676	8,676	8,676	8,676	8,676
Adj. $R^2$	0.04	90.0	0.08	0.09	0.00	0.09	0.09	0.09	0.00
$p: US \neq Offshore$	0.940	0.524	0.162	0.116	0.067	0.050	0.018	0.022	0.029
$p: US \neq Algo$	0.098	0.032	0.013	0.016	0.024	0.012	0.004	0.008	0.007
$p: US \neq Crypto$	0.007	0.009	0.019	0.042	0.027	0.032	0.042	0.039	0.043
$p$ : Offshore $\neq$ Algo	0.080	0.013	0.009	0.008	0.017	900.0	0.003	0.005	0.004
$p$ : Offshore $\neq$ Crypto	0.007	0.005	0.024	0.051	0.039	0.040	0.112	0.086	0.094
$p$ : Algo $\neq$ Crypto	0.763	0.403	0.019	0.007	0.043	0.004	0.000	0.000	0.000

Note: This table reports selected coefficient estimates from Equation (1) representing the cumulative flow impulse response function for US-based  $(\beta_0^1)$ , offshore asset-backed  $(\beta_0^2)$ , crypto-backed  $(\beta_0^3)$ , and algorithmic  $(\beta_0^4)$  stablecoins. Observations are weighted by pre-event market capitalization. All regressions include coin fixed effects. Standard errors are clustered at the coin and date level. T-statistics are in parentheses. Stars indicate statistical significance at the 10% (\*), 5% (\*\*), and 1% (\*\*\*) levels. true model is a  $VAR(p_0)$ ." Montiel Olea and Plagborg-Møller (2021) also suggest using simple robust standard errors instead of clustered standard errors. Thus, in Table B.3, we report the results of a specification analogous to Equation (1), but including 31 daily lags and using robust standard errors. The point estimates are essentially identical and more statistically significant.

In unreported results, we estimate every combination of robust and clustered standard errors with 1, 2, 3, 7, 14, and 31 daily lags. None of the point estimates are materially different from the reported ones, and the statistical significance remains for almost all coefficients in almost all specifications.

Table B.3: Local projection estimates of stablecoin cumulative flow on Bitcoin shock: Longer lags

		Depende	nt Variabl	Dependent Variable: Cumulative Percent Outflows h Days After Shock	ive Percen	t Outflows	h Days Af	ter Shock	
	h = 0	h = 1	h = 2	h = 3	<i>h</i> = 4	<i>h</i> = 5	<i>h</i> = 6	<i>h</i> = 7	<i>h</i> = 8
US-Based	-0.05	90.0	0.39	0.58*	0.86**	1.02**	1.19**	1.36**	1.52**
	(-0.25)	(0.22)	(1.36)	(1.72)	(2.08)	(2.07)	(2.10)	(2.23)	(2.28)
Offshore	-0.05	-0.16	-0.34	-0.71**	-0.85**	-1.09**	-1.24**	-1.42**	-1.50**
	(-0.77)	(-0.85)	(-1.54)	(-2.04)	(-2.07)	(-2.25)	(-2.42)	(-2.57)	(-2.45)
Algorithmic	-2.64*	-4.12**	-6.75**	-6.91**	-6.71**	-7.56**	-9.85***	-9.82**	-10.45***
	(-1.84)	(-2.43)	(-2.53)	(-2.33)	(-2.15)	(-2.37)	(-2.77)	(-2.52)	(-2.59)
Crypto-Collateralized	-2.06***	-2.56***	-3.31***	-3.01***	-3.46***	-3.40***	-3.75***	-4.24***	-4.08***
	(-4.60)	(-4.38)	(-4.39)	(-3.13)	(-3.33)	(-3.16)	(-3.30)	(-3.65)	(-3.46)
Coin FE	Y	Y	Y	Y	Y	Y	Y	Y	Y
N. Obs.	8,426	8,426	8,426	8,426	8,426	8,426	8,426	8,426	8,426
$Adj. R^2$	0.12	0.14	0.16	0.17	0.17	0.18	0.19	0.19	0.19
$p: US \neq Offshore$	0.990	0.486	0.044	0.008	0.003	0.002	0.001	0.001	0.001
$p: US \neq Algo$	0.073	0.015	0.008	0.012	0.016	0.008	0.002	0.005	0.003
$p: US \neq Crypto$	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000
$p$ : Offshore $\neq$ Algo	0.070	0.020	0.017	0.038	0.063	0.045	0.017	0.033	0.028
$p$ : Offshore $\neq$ Crypto	0.000	0.000	0.000	0.024	0.019	0.050	0.045	0.028	0.052
$p$ : Algo $\neq$ Crypto	0.697	0.385	0.215	0.210	0.322	0.217	0.103	0.170	0.129

US-based  $(\beta_0^1)$ , offshore asset-backed  $(\beta_0^2)$ , crypto-backed  $(\beta_0^3)$ , and algorithmic  $(\beta_0^4)$  stablecoins. The specification is modified to include 31 lags for the dependent and independents variables. Observations are weighted by pre-event market capitalization. All regressions Note: This table reports selected coefficient estimates from Equation (1) representing the cumulative flow impulse response function for include coin fixed effects. Robust standard errors are in parentheses. T-statistics are in parentheses. Stars indicate statistical significance at the 10% (\*), 5% (\*\*), and 1% (\*\*\*) levels.