# **DISCUSSION PAPER SERIES**

DP12171 (v. 2)

## FINANCIAL DEVELOPMENT AND MONETARY POLICY: LOAN APPLICATIONS, RATES, AND REAL EFFECTS

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Discussion Paper DP12171 First Published 21 July 2017 This Revision 13 May 2020

## Centre for Economic Policy Research 33 Great Sutton Street, London EC1V 0DX, UK Tel: +44 (0)20 7183 8801 www.cepr.org

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## Abstract

The finance-growth literature argues that institutional constraints in developing countries impede financial intermediation and monetary policy transmission. Recent studies using aggregate data document a weak bank lending channel. For identification, we instead exploit Uganda's supervisory credit register, with loan applications and rates, and unanticipated variation in monetary policy. A monetary tightening strongly reduces credit supply—increasing loan application rejections and tightening volume and rates—especially for banks with more leverage and sovereign debt exposure (even within the same borrower-period). There are spillovers on inflation and eco- nomic activity, especially in more financially-developed areas, including on commercial building, trade, and social unrest.

JEL Classification: E42, E44, E52, E58, G21, G28

Keywords: Financial Development, Bank credit, bank lending channel, monetary policy, Real effects, developing countries

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Acknowledgements

We thank the Bank of Uganda, Compuscan Uganda CRB Ltd., and the Uganda Bureau of Statistics, for providing the data used in this study and assisting us with queries and advice. We thank Thorsten Beck, Andrew Berg, Ata Can Bertay, Olivier Blanchard, Ales Bulir, Rupa Duttagupta, Kinda Hachem, Hideaki Hirata, Tommaso Mancini-Griffoli, Stelios Michalopoulos, Peter Montiel, Steven Ongena, Catherine Pattillo, Mahvash Qureshi, Marta Reynal Querol, An- dré Silva, Silvana Tenreyro, Neeltje Van Horen, Tomasz Wieladek, Ling Zhu, staff at the Bank of Uganda, and partic- ipants at numerous conferences and seminars for useful

comments and discussions. We thank Jeffrey Dickinson and Manzoor Gill for outstanding research assistance. This paper is part of a research project on macroeconomic policy in low-income countries supported by the U.K.'s Department for International Development (DFID). José-Luis Peydró acknowledges financial support from project ECO2015-68182-P (MINECO/FEDER, UE) and the European Research Council Grant (project 648398). The views expressed herein are those of the authors and should not be attributed to the Bank of Uganda, DFID, the IMF, its Executive Board, or its management.

## Monetary Policy and Bank Lending in Developing Countries: Loan Applications, Rates, and Real Effects\*

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Journal of Development Economics, accepted

### Abstract

Recent studies of monetary policy in developing countries document a weak bank lending channel based on aggregate data. In this paper, we bring new evidence using Uganda's supervisory credit register, with microdata on loan applications, volumes and rates, coupled with unanticipated variation in monetary policy. We show that a monetary contraction reduces bank credit supply—increasing loan application rejections and tightening loan volume and rates—especially for banks with more leverage and sovereign debt exposure. There are associated spillovers on inflation and economic activity—including construction permits and trade—and even social unrest.

**JEL Codes:** E42; E44; E52; E58; G21; G28.

**Keywords:** Bank lending channel of monetary policy; Bank credit; Real effects; Credit register; Developing countries.

<sup>\*</sup>We thank the Bank of Uganda, Compuscan Uganda CRB Ltd., and Uganda Bureau of Statistics, for providing the data used in this study and assisting us with queries and advice. We thank David Lagakos (the editor), three anonymous referees, Thorsten Beck, Andrew Berg, Ata Can Bertay, Olivier Blanchard, Ales Bulir, Rupa Duttagupta, Kinda Hachem, Hideaki Hirata, Tommaso Mancini-Griffoli, Stelios Michalopoulos, Peter Montiel, Steven Ongena, Catherine Pattillo, Mahvash Qureshi, Marta Reynal Querol, André Silva, Silvana Tenreyro, Neeltje Van Horen, Tomasz Wieladek, Ling Zhu, staff at the Bank of Uganda, and participants at numerous conferences and seminars for useful comments and discussions. We thank Jeffrey Dickinson and Manzoor Gill for outstanding research assistance. Earlier versions of this paper appeared as CEPR Discussion Paper 12171 and IMF Working Paper 15/270. This paper is part of a research project on macroeconomic policy in low-income countries supported by the U.K.'s Department for International Development (DFID). The views expressed herein are those of the authors and should not be attributed to the Bank of Uganda, DFID, the IMF, the Federal Reserve System, their staff, management, or policies. José-Luis Peydró acknowl-edges financial support from project ECO2015-68182-P (MINECO/FEDER, UE) and the European Research Council Grant (project 648398).

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## 1 Introduction

In developing countries, institutional constraints hamper financial intermediation and public policy effectiveness (Beck, Levine and Loayza, 2000; Levine, Loayza and Beck, 2000). Monetary policy transmission, for instance, is hindered by weaknesses in the legal environment, underdeveloped financial markets, and concentrated banking systems (Mishra, Montiel, Pedroni and Spilimbergo, 2014). Stanley Fischer, the Federal Reserve's Vice Chairman, points out that in developing countries "interbank markets are still underdeveloped, and, even though some central banks use policy rates, changes to these policy rates have only limited effect on other interest rates and on the economy more generally" (Fischer, 2015). Olivier Blanchard, IMF Chief Economist, argues that "the macroeconomics of low-income and of advanced economies are incredibly different [...]. The role of banking—both its existence and governance—seems so essential to understanding how for example monetary policy is transmitted to the economy" (Blanchard, 2014). The existing literature documents a weak or nonexistent traditional bank lending channel, but is confronted with data and methodological challenges.

In this paper we shed new light on the bank lending channel of monetary policy in developing countries using Uganda as a case study. Uganda is a fast-growing, bank-dependent African economy which shares many characteristics with countries at the same level of development (for instance, low levels of financial intermediation).<sup>1</sup> Over the past decade, the financial system experienced rapid growth and diversification and the country became increasingly integrated with regional and global capital markets. These factors led Uganda, like other low and lower-middle income countries, to take steps towards adopting a more forward-looking monetary policy framework (IMF, 2015). Specifically, in July 2011, the Bank of Uganda transitioned from a traditional, backward-looking monetary targeting framework, to an inflation targeting (IT) "lite" framework, in order to meet the challenges of macroeconomic management generated by the recent transformation of the economy.

We test the bank lending channel in Uganda during a four-year period around the introduction of the new monetary policy framework (2010-2014), with two objectives. First, we wish to

<sup>&</sup>lt;sup>1</sup>In Uganda, the domestic private credit-to-GDP ratio, a measure of financial development, increased from 7.5% in 2006 to 16% in 2016, compared to 25% in low-income countries, 63% in lower-middle income countries, 123% in middle-income countries, and 200% in high-income countries (data from the World Bank's World Development Indicators). Financial development gaps are a common feature throughout Africa and low bank presence is a key contributing factor (Allen, Carletti, Cull, Senbet and Valenzuela, 2014). As in other developing countries, banks are the main source of external finance for firms and bank financing is an important driver of entrepreneurship and firm growth (Banerjee and Duflo, 2014; Giannetti, 2003; Rajan and Zingales, 1998).

better understand the effects of monetary policy in developing economies that pursue price and financial stability objectives through modern monetary policy frameworks. Second, we wish to systematically document the behavior of banks in developing countries in the face of significant fluctuations in monetary conditions. We are able to undertake this analysis because Uganda has an extensive credit register with the universe of loan applications and rates and has had, as we will argue, largely unanticipated variations in monetary policy. In addition to detailed microdata on the lending activities of commercial banks, we also bring to the analysis extensive information on local economic activity, including data on construction permits, trade, and social unrest.

We exploit a high degree of variation in monetary conditions during the period of analysis, ranging from highly contractionary to highly expansionary. Following inflationary pressures from a commodity price shock coupled with strong credit growth, the Bank of Uganda raised the policy rate in the second half of 2011 by a cumulative 1,000 basis points (bps). After this tightening, the economy slowed down and the Bank of Uganda gradually cut the policy rate by a total of 1,100 bps over the following year.<sup>2</sup> Previous studies that employ narrative or data-driven approaches to identify monetary policy shocks, argue that the timing and the extent of the tightening episode in mid-2011 were at least partly unexpected by economic agents (Berg, Charry, Portillo and Vlcek, 2018; Willen, 2018). One reason is that the track record of the central bank was one of accommoda-tive monetary policy in the face of sizable price shocks, casting doubt on whether a tightening would occur during this period at all. These arguments, together with our own analysis of central bank communications and media coverage during the sample period, suggest a lack of anticipation of central bank actions, and help with identification. Moreover, our specifications include comprehensive controls for economic activity and prices to reduce the influence of potentially confounding factors.

A key challenge for testing the bank lending channel of monetary policy is to isolate changes in loan supply from changes in loan demand, given that aggregate macroeconomic shocks affect bank credit through both the bank lending and the firm borrowing channels. To overcome this empirical identification challenge, we use granular data from the credit register which covers all corporate loans extended by banks in Uganda. The data includes individual loan applications by non-financial firms, with accept/reject decisions, and the terms of new originated loans, including volume and interest rate. Such granular data, especially on loan applications and loan pricing, are

<sup>&</sup>lt;sup>2</sup>Changes in money market interest rates during the period of analysis are unusually large by historical standards, falling in the top 5% of interest rate changes for developing economies since 1980.

absent in most credit registers around the world, including in advanced economies. We match these loan-level data with supervisory bank balance sheet data on a quarterly basis.

Our specifications include macroeconomic controls, bank balance-sheet interactions, and a multitude of fixed effects. In the baseline lending regressions, we separate the effects of monetary policy proxied by changes in short-term interest rates from those of macroeconomic conditions by controlling for real GDP growth and inflation. Following Kashyap and Stein (2000) and Jiménez, Ongena, Peydró and Saurina (2012), we allow the effects of monetary policy to vary with bank capital and liquidity, while including time fixed effects to capture all macroeconomic factors that change simultaneously with policy rates, as well as bank and firm fixed effects to control for unobserved bank and firm characteristics. In addition, we use time-varying borrower fixed effects in specifications involving bank balance-sheet interactions to control for credit demand shocks. In the spirit of Khwaja and Mian (2008), our main specifications compare loans to firms in narrowly defined clusters (in the same industry and district) that borrow *in the same quarter* from banks with varying levels of capital and liquidity. In more demanding specifications we include firm×year fixed effects and hence compare loans to the same firm borrowing *in the same year* from different banks (similar to Jimenez, Mian, Peydró and Saurina (2015)). Our results are quantitatively similar across these alternative sets of fixed effects.<sup>3</sup>

Matching the microdata from the credit register with extensive regional statistics, we also analyze the impact of the bank lending channel on the real economy and prices. In particular, we match the exact locations (districts) of the lending bank branch and the borrowing firm with measures of real economic activity at different frequencies (monthly, quarterly, and yearly). Outcome variables in our real-effects regressions include (non-food, utilities and transport) inflation, permits for commercial construction, volume of exports, and public demonstrations as a broad indicator of the quality of economic and living conditions. We show that monetary policy rates have significant effects on all these indicators of real economic activity.

Our results document a strong bank lending channel of monetary policy (Bernanke and Blinder, 1988, 1992; Kashyap and Stein, 2000), with sizeable effects on real activity and prices. An increase in short-term interest rates by one standard deviation reduces the likelihood of loan granting in the same quarter by 1.2-2.8 percentage points, depending on model specification, which

<sup>&</sup>lt;sup>3</sup>In addition, our results are robust to controlling not only for GDP growth and inflation, which capture local economic conditions and allow us to test the impact of the real interest rate on bank lending decisions, but also to other internal factors such as fiscal policy and economic uncertainty, and external factors such as the terms of trade and the exchange rate. We allow these variables to enter our main specifications both in levels and interactions and explore specifications with different sets of fixed effects.

given the rejection rate, implies a semi-elasticity of 7.4-17.2%. An increase in short-term rates by one standard deviation reduces the volume of new loans by 10.2-20.3%. About half of the variation in market interest rates translates into changes in loan rates, indicating an economically significant pass-through.<sup>4</sup> Additionally, we show that better-capitalized banks transmit changes in monetary policy significantly less than thinly-capitalized banks, consistent with the behavior of banks in advanced economies (Kashyap and Stein, 2000; Bernanke, 2007; Jiménez, Ongena, Peydró and Saurina, 2012). By contrast, we find that banks with higher liquidity adjust credit supply more (not less) to monetary policy changes. The effect of liquidity—mainly reflecting exposure to sovereign debt—on the bank lending channel is stronger for banks more likely to be subject to moral suasion, which suggests that a monetary tightening leads those banks to further invest in government securities at the expense of new lending to firms—a "crowding out" effect that is common in developing countries (Hauner, 2009; Allen, Otchere and Senbet, 2011).

The real effects of the bank lending channel are consistent with the effects on credit. We show that inflation and real outcomes are less affected by a monetary policy tightening in districts where banks have more capital and lower liquidity. Using granular data on export volumes of individual product categories to individual countries, we assess the impact of monetary policy on trade controlling for external export demand with product×destination×year fixed effects. We also examine the effects of monetary policy on public demonstrations—a relevant outcome given that tight money and credit can lead to social unrest and populist movements.<sup>5</sup>

Our study contributes to the literature on the bank lending channel of monetary policy in developing countries. In a survey of this literature, Mishra and Montiel (2013) argue that weak monetary policy transmission in developing countries is mainly caused by structural impediments,<sup>6</sup> but they also emphasize methodological deficiencies, in particular the heavy use of vector autoregressions on aggregate time-series data. We bring to this literature an analysis of the bank lending

<sup>&</sup>lt;sup>4</sup>In addition, we find no evidence of substitution to foreign currency loans when domestic monetary conditions tighten.

<sup>&</sup>lt;sup>5</sup>See, e.g., Acemoglu and Robinson (2000); Besley and Persson (2011); Braggion, Manconi and Zhu (2018) and Mian, Sufi and Trebbi (2014) for analyses of the link from economic shocks to social stability.

<sup>&</sup>lt;sup>6</sup>This literature emphasizes the macroeconomic characteristics that weaken the bank lending channel in developing countries, such as smaller banking sectors, illiquid financial markets, and uncompetitive banking landscape (Mishra, Montiel, Pedroni and Spilimbergo, 2014). Saxegaard (2009) shows that banks in sub-Saharan Africa hold reserves in excess of the level consistent with a precautionary savings motive, and argues that excess liquidity in the banking system weakens the monetary transmission mechanism. Barajas, Chami, Ebeke and Oeking (2018) document that countries with large remittance flows have weaker monetary policy transmission. Bulir and Vlcek (2015) find a stronger interest rate transmission mechanism along the yield curve of government securities in developing countries with relatively more credible IT regimes. Consistent with their findings, for Uganda we observe a fair degree of co-movement between the policy rate introduced in July 2011 and short-term market interest rates (such as the 7-day interbank rate) as well as longer-term rates on government securities (e.g. the 91-day T-bill rate), as seen in Figure A1.

channel in a developing country that is, for the first time, based entirely on microdata from a credit register. These data make it possible to control for changes in loan demand at a more granular level than in previous studies and hence more credibly to isolate credit supply from demand effects. In addition, we can precisely estimate the interest-rate impact on the price of newly originated loans, rather than that on the existing stock of loans that is captured in aggregate lending rate statistics.

Furthermore, our paper documents important differences in monetary policy transmission between advanced economies and developing countries, where governance, institutions, and the market incompleteness play a relatively more prominent role for the economic impact of monetary policies. In these countries, low intermediation ratios are the result of weak property rights and contractual frameworks, which in turn aggravate informational problems and frictions in lending. Small and illiquid capital markets where short-run government paper is dominant further impair the channels of transmission. Uganda is representative not only for the region but also for other developing countries with which it shares the aforementioned structural characteristics. At the same time, in recent years Uganda has experienced rapid economic growth and financial development, prompting efforts to modernize the monetary policy framework and transition to inflation targeting, a common trend among developing countries in other parts of the world as well.<sup>7</sup> These elements provide some comfort in relation to external validity concerns.

The paper is organized as follows. In Section 2 we describe the institutional context, macroeconomic conditions, and banking system in Uganda. In Section 3 we describe our data. Sections 4 and 5 outline the empirical approach and present the results for the loan supply and real effects of the bank lending channel. We conclude in Section 6.

## 2 Institutional background

Uganda is an East African developing country with a flexible exchange rate regime and a moderate level of dollarization.<sup>8</sup> Historically, the Bank of Uganda followed a backward-looking monetary aggregate targeting framework that is common in developing countries (IMF, 2015; Berg and Por-

<sup>&</sup>lt;sup>7</sup>See EIB (2013) for a comparative analysis of the Ugandan banking system in relation to other countries in the East African Community (Burundi, Kenya, Rwanda, Uganda, and Tanzania); IMF (2015) for commonalities in financial sector supervisory standards; Berg and Portillo (2018) for the experience with the transition to inflation targeting regimes in sub-Saharan African; and Cas, Carrion-Menendez and Frantischek (2011) for the experience with modern monetary policy frameworks in Central America. In a study of monetary regimes in developing economies, Laurens, Eckhold, King, Maehle, Naseer and Durre (2015) place Uganda in the "inflation targeting" group for countries with floating exchange rate regimes alongside low- and middle income countries from Eastern Europe, Latin America, and Asia.

<sup>&</sup>lt;sup>8</sup>In 2013, the share of foreign currency assets was 31.6%, lower than in most East European countries (Brown and De Haas, 2012) but higher than the average for African countries (Christiensen, 2014). In Section 5.1 we discuss the possibility of substitution between the local and the foreign currency loan market during a monetary tightening.

tillo, 2018). Over the past decade, financial sector development driven by emerging technologies that enable households to manage money holdings and conduct banking operations, coupled with increasing capital market integration, led to irregularities in money demand and a more unstable relation between money demand and prices (IMF, 2009a).<sup>9</sup> The monetary targeting framework also led to significant interest rate volatility and failed to anchor inflation expectations (IMF, 2008). Following a long process of economic analysis and technical discussions with international financial institutions,<sup>10</sup> in July 2011 the Bank of Uganda moved to an IT-lite monetary policy framework and introduced a policy rate to signal the monetary policy stance.<sup>11</sup>

To place our analysis in context, in this section we describe monetary and macroeconomic developments in the years prior and during our period of analysis 2010-2014. We develop several arguments for the idea that the monetary policy stance was at least in part unanticipated by economic agents, which helps our identification strategy. Then we describe the main characteristics of the banking sector.

## 2.1 Macroeconomic context: Arguments for unanticipated monetary policy

Uganda faced two major external shocks around the period of analysis. First, a major food and fuel price shock generated inflationary pressures in most developing countries just before the 2008 financial crisis. However, as the crisis became global, price pressures subsided and inflation returned to single digits in 2009. A second commodity price shock hit the Ugandan economy in 2010-2011, sending inflation back into two-digit territory, and simultaneously affecting several East African countries. While the first shock waned due to external forces and in the absence of a strong monetary response, central banks in the region (Kenya, Rwanda, Tanzania, and Uganda) addressed the second shock with a significant monetary tightening. During July-November 2011 the Bank of Uganda raised the policy rate by a total of 1,000 bps: 300 bps between July and September and an additional 700 bps between September and November. Following the collapse of credit aggregates and economic growth, a phase of monetary easing began in January 2012. The policy rate was gradually reduced during the first three quarters of 2012 from 23% to 11%. Our period

<sup>&</sup>lt;sup>9</sup>Between 2000 and 2011, the velocity of the M2 aggregate declined from 9.4 to 5.5 in an erratic way.

<sup>&</sup>lt;sup>10</sup>This process can be traced back to IMF country reports about five years prior to the introduction of the new framework, see e.g., IMF (2007, 2009b).

<sup>&</sup>lt;sup>11</sup>The policy rate is a benchmark rate that guides short-term interbank rates. The Bank of Uganda carries out open market operations—overnight and 7-day repos on the secondary government securities market—to bring the 7-day interbank rate as close as possible to the benchmark rate. See IMF (2018) for details about the new framework and a review of the country's experience with it. See Berg and Portillo (2018), Kasekende and Brownbridge (2011) and Khan (2011) for detailed analyses of monetary policy frameworks in developing countries.

of analysis between 2010 and 2014 thus captures a full economic cycle (see Figures 1 and 2 for macroeconomic conditions and credit dynamics during this period).

Berg, Charry, Portillo and Vlcek (2018) use a narrative approach to identify monetary policy shocks from central bank communications (Romer and Romer, 1989) in the East Africa region. The authors conclude that economic agents in Uganda had little reason to anticipate the dramatic consecutive interest rate hikes that occurred in mid-2011; and argue that the "clean-cut nature of the [tightening] event" allows them "to consider it a natural experiment from which significant inferences can be drawn" (p. 5). The authors offer the following arguments. First, the Bank of Uganda had a dovish track record given that monetary policy had remained highly accommodative during earlier episodes of strong credit growth and inflation. For instance, the Bank of Uganda had reacted little to the 2008 commodity price shock despite soaring inflation and credit growth (see Figures A2 and A3), casting doubt it would tighten in 2011 at all, and if so, when and by how much. Second, before the mid-2011 tightening, the Bank of Uganda communicated through its monthly Economic and Financial Indicators report a need for the monetary authority to support strong economic activity rather than to address inflationary concerns. For instance, in April 2011 it considered the possibility that "at very fast growth rates, prices may have to rise to funnel resources to those areas where demand and output are rising particularly rapidly" but argued it "should not be too worried about this, particularly if growth is broad-based" (Bank of Uganda, 2011a). In the June 2011 report, it further ruled out a tightening by remarking that "given that inflation was largely caused by supply-side shocks, it was neither desirable nor feasible for BOU to bring inflation back to the targeted levels in the short run" (Bank of Uganda, 2011b). Third, the tightening phase starting in June 2011 coincided with the introduction of a new monetary policy framework that centered on targeting inflation rather than money supply. However, the Bank of Uganda did not publish an intermediate inflation trajectory until several months later in October 2011 (IMF, 2011, 2012), making it difficult for economic agents to form inflation expectations.

To these arguments we bring two additional pieces of evidence to further rule out anticipation effects around the mid-2011 tightening. The first piece of evidence comes from a detailed review of how analysts covered economic issues—especially inflation and monetary conditions—in the leading Daily Monitor newspaper (see Appendix A-IV for an overview of the relevant articles). In early 2011, as inflationary pressures were building up, commentators were praising the country's progress against inflation compared to 2009. As inflationary pressures mounted, in April 2011 the Daily Monitor wrote that "there is nothing the government can do to stop the soaring commodity

prices adding that the prices are fixed by market forces of demand and supply." In mid-2011 a series of articles discussed possible policy responses to skyrocketing inflation, including infrastructure reforms to relieve supply-side bottlenecks, but made no reference to a monetary policy response. The newspaper writes that the government "has neither proposed nor implemented any concrete short-term interventions to reverse the escalation in prices." Our review of articles published in the second half of 2011, after the first interest rate hike, reveals no announcements by the central bank to further raise interest rates.

The second piece of evidence comes from a recent data-driven analysis of monetary policy shocks across countries. Willen (2018) develops an algorithmic procedure to identify unanticipated monetary contractions, which reflect concerns over inflation rather than the future state of the real economy. The procedure specifically identifies episodes where a long period of monetary easing and high inflation is followed by a large nominal monetary policy rate increase. The author focuses on sizable interest rate increases to rule out instances of central bank optimism about future output developments and hence to identify only episodes of "exogenous" policy shifts. This data-driven algorithm is applied to yearly interest rate time-series from 162 countries over 1970-2017 and identifies 147 large monetary contractions, including Uganda-2011.

Finally, we would like to rule out potential confounding effects from shifts in central bank policies such as minimum reserve requirements or macroprudential tools. Importantly, the Bank of Uganda does not use cash reserve requirements as an active tool of monetary policy. The only change during the sample period was a reduction in reserve requirements in March 2011 (by 1.5 percentage points to 8% of total deposits). To the extent this change had an impact on the economy, it would dampen the effects of the monetary tightening that occurred in the second half of 2011. Furthermore, there were no changes in macroprudential policies during the period of interest.<sup>12</sup>

## 2.2 Banking system

Uganda experienced significant financial development during the 2000s, with bank credit to the private sector reaching 16.4% of GDP in 2016. This ratio remains nonetheless low by international standards and there is a large informal financial sector. Financial deepening in Uganda occurred through an expansion of bank presence and financial access. Data from the IMF's Financial Access

<sup>&</sup>lt;sup>12</sup>The relatively short sample period (2010-2014) also reduces the likelihood that structural transformation of the economy affects our analysis. Furthermore, in small open economies foreign monetary policy may act as an additional impulse on the local economy and may affect our results insofar as it is correlated with domestic monetary policy and it influences banks' access to funds. As argued in the next section, both domestic and foreign banks in Uganda mainly fund their operations with local deposits and hence are largely insulated from global financial conditions.

Survey indicates that the number of commercial banks rose from 15 in 2006 to 25 in 2016 (the same as in Nigeria) and the number of loan accounts doubled to 36 per 1,000 adults over the same period. The banking system comprises 25 (mostly foreign- and privately-owned) banks at the time of analysis and is highly concentrated, with the largest 5 banks accounting for almost 75% of banking system assets (GFDD, 2011). As is common in developing countries, most firms work with only one bank (Rajan and Zingales, 1998; Giannetti, 2003).

Banks are well capitalized and highly-liquid, with an average regulatory capital ratio of 23% and average liquid-to-total deposits ratio of 41%.<sup>13</sup> The typical bank funds its assets with 68% in deposits, 15% shareholders' equity, 4% market funding (primarily domestic interbank funding), and 12% other sources. The average bank holds 45% loans, 20% government securities, 4% cash, 12% (domestic and foreign) interbank assets, and 8% reserves at the central bank. The average loan portfolio is comprised of 64% private sector loans, 35% loans to individuals, and 1% loans to public sector enterprises.

## 3 Data

## 3.1 Credit register

Our study employs detailed data on the commercial lending activities of banks and the economic performance of the private sector. Uganda has a fully functional and comprehensive credit register that is maintained by the private credit bureau Compuscan Uganda CRB Ltd. under the supervision of the Bank of Uganda. The credit register was set up in 2008 and collects data on all loan applications (39,643 applications) and new originated loans (29,960 new loans) based on monthly reports from all commercial banks, microfinance deposit-taking institutions, and other credit institutions. Its coverage continuously improved over time and the data became representative by mid-2010.<sup>14</sup> Therefore, our period of analysis runs from 2010:Q3 until 2014:Q2. We use data for the largest 15 banks, which account for 95% of total banking assets.

The credit register collects information on both loan applications (with accept/reject decision) and loan originations (credit lines and term loans) to non-financial firms, with no restriction on the minimum size of the loan. We focus on local currency loans (in Ugandan shillings) which represent the majority of loan applications and more than half of outstanding private credit. For

<sup>&</sup>lt;sup>13</sup>Figure A4 shows the cross-sectional distributions of regulatory capital and liquidity—the two financial ratios used to identify the bank balance sheet channel.

<sup>&</sup>lt;sup>14</sup>For evidence on the representativeness of the credit register, see Figures A5 and A6 which compare the sample composition in the credit register by industry and region with aggregate statistics.

each individual loan application and granted loan, we observe the date and the terms of the loan such as the interest rate, maturity, and currency. We limit our sample to applications that were approved or rejected and exclude any records with pending or withdrawn status (34% and 0.2% of observations, respectively).

An important caveat is that banks make separate data submissions on loan applications and new granted loans (that is, there are distinct "loan application reports" and "loan origination reports" that feed into two separate supervisory datasets at the CRB) and they are not required by the CRB to identify borrowers with the same identifier across the two datasets. For these reasons, tracing successful loan applications in the loan origination dataset (and vice-versa) is infeasible, therefore we analyze loan applications and new granted loans separately.<sup>15</sup> The final cleaned sample has 16,784 (accepted/rejected) loan applications and 25,948 new granted loans between 2010:Q3 and 2014:Q2.

We identify borrowers uniquely using a numerical code that represents the concatenation of the available identifiers for each firm in each supervisory dataset. This identifier allows us to track firms' borrowing activities over time and across banks. We observe loan applications from 8,679 firms and loans granted to 8,718 firms. For each borrowing firm, we also have information on its location (in one of 66 districts) and sector of activity (9 industries), but there is no information on firm balance sheets. Looking at loan applications, over the full sample period 83% of firms apply for a loan to only one bank, 13% to two banks, and the rest to 3 or more banks. Looking at granted loans, 87% of firms borrow from one bank and 10% from two banks. In addition, only about one third of firms submit multiple loan applications in any given quarter.<sup>16</sup>

We merge the loan-level data with bank balance sheet variables and macroeconomic time series (e.g., interest rates, GDP growth, inflation, fiscal policy, GDP forecasts, etc.) at different time frequencies from the Bank of Uganda, the IMF International Financial Statistics (IFS), and the IMF World Economic Outlook (WEO).

<sup>&</sup>lt;sup>15</sup>Despite our best efforts, we were only able to trace very few granted loans as successful applications in the loan applications dataset and very few applications marked as "pending" as granted loans (so we can classify them as accepted/rejected). Unfortunately, these data limitations prevent us from estimating a two-stage selection model. See Appendix A-II for details on and a comparison of the two supervisory datasets.

<sup>&</sup>lt;sup>16</sup>The prevalence of single firm-bank relationships and the small number of repeated loan applications have important implications for the empirical strategy, which we discuss in Section 4.1.2.

## 3.2 Real economic activity

To examine the real effects of the bank lending channel we employ several measures of economic activity and living conditions *at the district level* (for up to 66 districts). These measures include construction permits, exports, public demonstrations, and non-food inflation and its main components. We briefly describe each economic indicator in turn.

Quarterly data on commercial building permits comes from Uganda Bureau of Statistics. We have information on the quarterly number of applications for construction permits for all districts. Growth in commercial building permits is a valuable indicator of local economic activity and is highly correlated with income growth across U.S. states (Calomiris and Mason, 2003).

Annual data on export volume is available from Uganda Bureau of Statistics for 20 districts where exports are recorded at customs offices. These highly-granular data are available for 97 distinct product categories (reported in Appendix A-III) and 105 destination countries. Thus we have one observation for each district-product-destination-year, which allows us to comprehensively control for time-varying export demand (as discussed in Section 5.1).

Data on public protests comes from the Armed Conflict Location and Event Data Project (ACLED) database, which records information on violence and conflict in developing countries. The variable records the total number of events defined as "riots and protests" and referring to organized or spontaneous demonstrations against a public or private institution, which may involve targeting property and businesses, as well as clashes with safety and security agencies. We compute the quarterly number of protests from daily data.

Lastly, monthly data on non-food CPI for 8 districts come from the Bank of Uganda. Nonfood expenditure accounts for almost 70% of the consumption basket. The main components of non-food expenditure are utilities (that is, housing, water, electricity, gas and other fuels) and transportation (each with a share of more than 15%). Smaller expenditure items, with weights of less than 10%, include clothing and footware, health, communications, education, recreation, and other goods and services. We focus the analysis on the overall non-food CPI and its two major components—utilities and transportation.

Detailed variable definitions and sources are shown in Table 1. Descriptive statistics for the variables in the regression sample are reported in Table 2.

## 4 Monetary policy and bank credit

## 4.1 Empirical strategy and hypotheses

In this section we discuss the empirical approach for examining the extensive and intensive margins of credit adjustment followed by the pass-through to loan rates. We focus on the identification of credit supply effects using a rich set of controls and fixed effects.

## 4.1.1 Extensive margin

To examine the link between monetary policy and the likelihood of loan granting—the extensive margin of lending—we estimate the following linear probability model:

$$\begin{aligned} LOAN \ GRANTED_{ibt} &= \eta_i + \psi_b + \alpha_1 \Delta IR_t + \beta_1 \Delta GDP_t + \gamma_1 \Delta CPI_t + \\ &+ \delta_1 CAPITAL_{b,t-1} + \delta_2 LIQUIDITY_{b,t-1} + \\ &+ \alpha_2 \Delta IR_t \times CAPITAL_{b,t-1} + \alpha_3 \Delta IR_t \times LIQUIDITY_{b,t-1} + \\ &+ \beta_2 \Delta GDP_t \times CAPITAL_{b,t-1} + \beta_3 \Delta GDP_t \times LIQUIDITY_{b,t-1} + \\ &+ \gamma_2 \Delta CPI_t \times CAPITAL_{b,t-1} + \gamma_3 \Delta CPI_t \times LIQUIDITY_{b,t-1} + \epsilon_{ibt} \end{aligned}$$

where LOAN GRANTED<sub>*ibt*</sub> takes value 1 if a loan application by firm *i* to bank *b* in quarter *t* was accepted, and 0 if rejected. Our measure of monetary policy is the change in the 7-day interbank rate ( $\Delta IR$ ).<sup>17</sup> We also add real GDP growth ( $\Delta GDP$ ) and inflation ( $\Delta CPI$ ) as controls for macroeconomic conditions that influence monetary policy decisions.<sup>18</sup> We allow differences in bank balance sheets to affect the likelihood of loan granting by including the ratio of total regulatory capital to risk-weighted assets as a measure of bank capital (*CAPITAL*) and the ratio of liquid assets to total deposits as a measure of bank liquidity (*LIQUIDITY*). Bank characteristics are lagged one quarter relative to the quarter of the application date.<sup>19</sup>

In a first set of regressions, unobserved time-invariant firm and bank heterogeneity is captured by firm ( $\eta_i$ ) and bank ( $\psi_b$ ) fixed effects, respectively. To account for shifts in credit demand, we control for unobserved time-varying borrower heterogeneity at a level as granular as possible. In particular, in the main specifications we include time-varying fixed effects at the firm-

<sup>&</sup>lt;sup>17</sup>This choice is motivated by the lack of a policy rate for the full sample period. See Section 4.4 for a discussion of monetary policy rate transmission to short-term interest rates in developing countries and robustness tests of our main results to alternative rates.

<sup>&</sup>lt;sup>18</sup>In Section 4.4 we examine the sensitivity of our results to controlling for additional macroeconomic conditions (e.g., fiscal policy, uncertainty, exchange rates, and terms of trade); and to replacing the interbank rate with a measure of monetary policy surprises based on a Taylor (1993)-type interest rate rule.

<sup>&</sup>lt;sup>19</sup>In Section 4.4 we show our results for bank capital and liquidity are not driven by other bank characteristics such as bank age, size, and foreign ownership.

cluster level, where a cluster includes the firms in the same district and industry (that is, we have "district-industry×quarter-year" fixed effects). In a supplementary regression we include firm×year fixed effects. District-industry×quarter-year fixed effects capture unobserved factors such as time-varying demand shocks that are common to all firms in the same industry and district. Firm×year fixed effects exploit multiple loan applications by a given firm in a year to control for time-varying shifts in unobservables (including credit demand) at the firm level.

Interactions of bank capital and liquidity with  $\Delta IR$  allow the bank lending channel to depend on banks' financial positions. Our empirical specifications are guided by several theoretical arguments. For a given increase in short-term interest rates, banks with more capital should be in a better position to support loan growth because they have more loanable funds (Kashyap and Stein, 1994) and/or may be able to attract deposits and market funds on better terms than other banks (Bernanke, 2007; Gambacorta and Shin, 2018).<sup>20</sup> Therefore, we expect high capital to dampen the effects of a monetary contraction ( $\alpha_2 > 0$ ).

The argument for liquidity may go either way. In advanced economies, higher liquidity is a sign of financial health. Banks with more liquidity can more easily protect their loan portfolio during a monetary tightening by drawing down on the stock of liquid securities (Kashyap and Stein, 2000). Banks with more liquidity may also be seen as financially resilient and enjoy a lower cost of funds (Bernanke, 2007). Therefore, in advanced economies the bank balance sheet channel predicts  $\alpha_3 > 0$ . By contrast, banks in developing countries tend to hold large amounts of sovereign debt (primarily Treasury securities) due to the high cost of financial intermediation (Allen, Otchere and Senbet, 2011).<sup>21</sup> An interest rate increase could worsen information frictions in lending (e.g., adverse selection) and affect the risk-return calculus in such a way that banks with more liquidity, which "specialize" in holding government debt over making risky loans—might choose to further invest in Treasury securities than to expand the loan portfolio. In this environment it is possible that relatively more liquid banks respond to a monetary tightening by cutting loans more aggressively than other banks (leading to  $\alpha_3 < 0$ ). Furthermore, this effect could be stronger for banks that are more likely to be subject to "moral suasion," a mechanism by which banks are pressured to support the government by holding government debt (Ongena, Popov and Van Horen, 2016;

<sup>&</sup>lt;sup>20</sup>The degree to which banks are capital-constrained from a regulatory standpoint may also matter, as banks for which the capital requirement is binding are more likely to pass up current profitable lending opportunities to avoid future losses (Van den Heuvel, 2012). This mechanism, however, is less relevant for our analysis given that banks in Uganda have capital ratios that are well in excess of the regulatory minimum.

<sup>&</sup>lt;sup>21</sup>Using the World Bank classification of countries by income group, in low-income countries the share of banking sector sovereign debt exposure in total banking assets was 19% compared to 16.4% in emerging markets and 8.6% in advanced economies during 2000-2014 (IMF International Financial Statistics.)

Altavilla, Pagano and Simonelli, 2017; Becker and Ivashina, 2018).

Following studies of loan approvals (Jiménez, Ongena, Peydró and Saurina, 2012; Puri, Rocholl and Steffen, 2011)), we estimate Equation 1 with Ordinary Least Squares (OLS). We choose a linear probability model because non-linear models can be unidentified if there are many fixed effects and short panels can produce inconsistent estimates of interactions terms (Ai and Norton, 2003). The standard errors are clustered at the district level to allow for serial correlation within districts.<sup>22</sup>

#### 4.1.2 Intensive margin and loan rates

For each granted loan we have information on volume, interest rate, and maturity. Given the prevalence of single bank relationships by individual firms, we set up the data at the bank-firm cluster-quarter level where a firm cluster includes all the firms in a given district and industry (for a total of 287 district-industry pairs). Then we compute average loan volumes for each bank-firm cluster-quarter combination as in Khwaja and Mian (2008). This data set-up allows us to include in the main specifications district-industry×year-quarter fixed effects which control for unobserved credit demand under the assumption that all firms in the same industry and district receive a common quarterly demand shock. In an alternative specification we show that the results hold up to setting up the data at the bank-firm-year level by averaging loan volumes extended by each bank to each firm within the year and adding firm×year fixed effects to control for time-varying unobserved firm-level credit demand.<sup>23</sup>

 $<sup>^{22}</sup>$ In Section 4.4 we check the robustness of our results to alternative levels of clustering the standard errors (see Table A12).

<sup>&</sup>lt;sup>23</sup>Our approach of controlling for time-varying unobserved heterogeneity at the districy-industry level is similar to Acharya, Eisert, Eufinger and Hirsch (2016), Auer and Ongena (2016), and De Haas and Van Horen (2013) who examine corporate loan supply following bank financial shocks and control for loan demand at a level of aggregation that is higher than the individual firm (i.e., firm cluster). The motivation is similar to ours: credit rationing at the individual firm level creates intensive margin adjustment at the firm cluster level, and firms mainly form relationships with a single bank. Degryse, De Jonghe, Jakovljević, Mulier and Schepens (2018, p. 34) use credit register data which firms often borrow solely from one bank and show that fixed effects for firms clusters (where a cluster comprises firms of similar size in the same industry and location) "perform very well as controls for the firm-borrowing channel: the bank-loan supply shocks obtained with such demand controls closely resemble the "standard" bank-loan shocks (in terms of ordering and magnitude) for the multiple-bank firm sample." Furthermore, as a robustness test, in Table A11 we show that our main results for the intensive margin and loan rates hold up in the original dataset at the loan level.

We estimate the following specification:

$$ln(NEW \ LOANS_{jbt}) = \psi_b + \phi_j + \alpha_1 \Delta IR_{t,t-z} + \beta_1 \Delta GDP_t + \gamma_1 \Delta CPI_t + \\ + \delta_1 CAPITAL_{b,t-1} + \delta_2 LIQUIDITY_{b,t-1} + \\ + \alpha_2 \Delta IR_{t,t-z} \times CAPITAL_{b,t-1} + \alpha_3 \Delta IR_{t,t-z} \times LIQUIDITY_{b,t-1} + \\ + \beta_2 \Delta GDP_t \times CAPITAL_{b,t-1} + \beta_3 \Delta GDP_t \times LIQUIDITY_{b,t-1} + \\ + \gamma_2 \Delta CPI_t \times CAPITAL_{b,t-1} + \gamma_3 \Delta CPI_t \times LIQUIDITY_{b,t-1} + \epsilon_{ibt}$$

$$(2)$$

where *NEW LOANS*<sub>*jbt*</sub> is the volume of new loans granted to firms in district-industry *j* by bank *b* in quarter *t* (or to firm *j* by bank *b* in year *t* in the alternative specification). The main variable of interest is the change in the short-term interest rate ( $\Delta IR_{t,t-z}$ ) over different time horizons, which allows short-term rates to affect loan volumes with a lag. We find the most consistent and precisely estimated effects at a lag of 2 quarters, on which we settle for the baseline specifications.<sup>24</sup>

The coefficient of interest  $\alpha_1$  is the interest rate elasticity of loan volume supplied by individual banks to firms in the same district-industry cluster. We expect  $\alpha_1 < 0$ . We estimate specifications with district-industry fixed effects ( $\phi_j$ ) and bank fixed effects ( $\psi_b$ ), followed by macroeconomic and bank-level controls, and finally interactions of  $\Delta IR$  with bank capital and liquidity. In specifications with balance sheet interactions we control for time-varying loan demand with district-industry×year-quarter fixed effects or with firm×year fixed effects. We expect  $\alpha_2$  and  $\alpha_3$  to take the same sign as in the extensive margin regressions.

Then we examine the pass-through of the interbank rate to interest rates charged by banks on new loans in a specification similar to Equation 2. The main difference is that the dependent variable is the average loan rate on granted loans and is defined separately for each data structure.<sup>25</sup> For instance, in the bank-firm-year panel, the average loan rate is computed across loans granted by a given bank to a given firm each year. Similar to the extensive margin regressions, all regressors are lagged 1 quarter.

Regressions are estimated with OLS and standard errors are clustered at the district level. The specifications for loan volumes and rates are robust to the same sensitivity tests discussed in relation to loan applications (see Section 4.4).

<sup>&</sup>lt;sup>24</sup>For completeness, Table A1 reports the intensive margin results for a lag of 1 quarter or the average over 1 and 2-quarter lags.

<sup>&</sup>lt;sup>25</sup>Reported results correspond to the unweighted average interest rate, but are virtually identical for the loan volumeweighted average interest rate (not reported).

### 4.2 Results

#### 4.2.1 Extensive and intensive margins of lending

Table 3 reports the results for the extensive margin of lending. We start with simple specifications that include bank and firm fixed effects (columns 1-3). The coefficient estimates on  $\Delta IR$  indicate that a standard deviation (SD) increase in the 7-day interbank rate over one quarter (359 bps) reduces the probability of loan granting by between 1.2 and 2.8 percentage points, or a semielasticity of 7.4-17.2% implied by the loan application rejection rate of 16.3%.<sup>26</sup>

In columns 4-5 we include interaction terms of  $\Delta IR$  with bank capital and liquidity. Using the estimates in column 4, we find that the differential effect of a rise in the interbank rate by one SD between a highly and a thinly-capitalized bank (90th vs. 10th percentile) is 4.9 percentage points (semi-elasticity of 30.6%).<sup>27</sup> Put differently, banks with higher levels of capital pass on a monetary tightening to the supply of credit less than banks with lower levels of capital. By contrast, we observe that more liquid banks amplify the negative effect of an interest rate rise. In column 5 we show a specification with balance-sheet interactions and even more demanding controls for credit demand in the form of firm×year fixed effects. Despite a sharp reduction in sample size (as singletons drop out), the coefficients on the interaction terms between  $\Delta IR$  and capital and liquidity remain statistically significant and become slightly larger in absolute terms.

Table 4 reports the intensive margin results. Across specifications (columns 1-3), we find that a monetary tightening is associated with lower volumes of new loans, controlling for macroeconomic conditions and bank balance sheet characteristics. The coefficient estimates on  $\Delta IR$  indicate that a SD increase in the short-term interest rate over two quarters (644 bps) reduces bank credit by between 10.2% and 20.3%. In column 4 we add district-industry×year-quarter fixed effects and test the bank balance sheet channel. We find that higher capital dampens the transmission of monetary policy to credit supply and higher liquidity amplifies it. One SD increase in interest rates over two quarters leads high-capital banks (at the 90th percentile) to reduce the volume of new loans by 47.7% more than low-capital banks (at the 10th percentile).<sup>28</sup> When we saturate the

<sup>&</sup>lt;sup>26</sup>It is informative to compare our estimates with those for advanced economies. Jiménez, Ongena, Peydró and Saurina (2012) show that a 100 bps increase in the Spanish 3-month interbank rate (almost one SD) raises the rejection rate on loan applications by 1.4 percentage points. We can see that a much larger interest rates increase is required in Uganda to achieve the same impact on loan rejection rates as in Spain, consistent with the large difference in the amplitude of economic cycles between advanced and developing countries documented, for instance, in Claessens, Kose and Terrones (2012).

 $<sup>^{27}</sup>$  The 90th and 10th percentiles of the capital ratio distribution are 34 and 15 percent, therefore the differential effect is given by 359  $\times$  (34 – 15)  $\times$  0.0721/100 = 4.9.

 $<sup>^{28}644 \</sup>times (34 - 15) \times 0.0039 = 47.7.$ 

specification with firm×year fixed effects (column 5), the coefficient estimates on the balance sheet interaction terms retain their statistical significance.

Next, we explore heterogeneity in the bank balance sheet channel for liquidity. We argue that increased sovereign bond holdings by banks are a reflection of the high cost of financial intermediation. Higher interest rates raise yields on government bonds, making government debt more attractive than risky loans, and further crowing out bank lending. This phenomenon, documented for banks in several advanced economies during the European sovereign debt crisis, was caused by government pressure on the banking system to increase their holdings of local sovereign debt (Ongena, Popov and Van Horen, 2016; Altavilla, Pagano and Simonelli, 2017; Becker and Ivashina, 2018). Taking this argument to our context, we test whether the liquidity channel is stronger for banks that are more likely to be subject to moral suasion. We measure bank-specific exposure to moral suasion with the share of loan applications received by each bank from public sector enterprises over the full period of analysis. We define banks subject to high/low moral suasion as those with above/below mean share of loan applications from the public sector, and re-run the relevant specification (i.e., column 5 in Tables 3 and 4) with a spline on the  $\Delta IR \times LIQUIDITY$  term. The results are reported in Table 5, including p-values for a one-sided t-test of the null hypothesis that banks with higher public debt shrink corporate loan supply even more than other banks following an interest rate increase. According to the reported p-values, we fail to reject the null hypothesis, consistent with the moral suasion argument.<sup>29</sup>

#### 4.2.2 Loan rates

Next we quantify the pass-through of changes in short-term interest rates to retail loan rates. Table 6 reports the results for specifications that are similar to the previous section. The coefficient estimates on  $\Delta IR$  in columns 1-3 show that a 100 bps increase in the 7-day interbank rate is associated with an increase in the loan rate of between 33 and 49 bps. The latter coefficient is not statistically different from 50 bps, indicating a pass-through of almost 50%.

The results also reveal differential effects based on bank capital and liquidity. As seen in column 4 of Table 6, high-capital banks charge 234 bps less than low-capital banks (at the 90th vs. 10th percentile of the capital distribution) for an increase of one SD in interest rates over one quar-

<sup>&</sup>lt;sup>29</sup>The results are robust to measuring exposure to moral suasion based on loan volumes rather than number of loan applications (results not reported). We do not find any evidence of bank heterogeneity in the liquidity channel based on bank ownership (foreign vs. domestic), bank age, or other bank attributes such as risk profile and profitability.

ter.<sup>30</sup> By contrast, more liquid banks pass through the increase in the short-term rate more than less liquid banks. Notice, however, that the differential effect across bank capital is no longer statistically significant when we include more demanding sets of fixed effects, even though the point estimate does not vary much (column 5).

### 4.3 Asymmetry and lags in monetary policy transmission

Asymmetry of monetary policy transmission. Studies of the U.S. economy document stronger effects of monetary policy on nominal and real variables—such as consumption of durable goods, investment, and output—during expansions than contractions (see, e.g., Morgan (1993) and Tenreyro and Thwaites (2016)). We allow for asymmetric effects of monetary policy in our baseline specifications with a spline of the  $\Delta IR$  variable for the tightening (2010:Q3-2011:Q4) and easing (2012:Q1-2014:Q2) periods. The results are reported in Table A2 together with p-values of a t-test of equality of coefficients on the spline terms (the null hypothesis implies symmetric effects). The coefficients on the spline terms are statistically significantly different from one another in the extensive margin regressions, suggesting an asymmetric effect of interest rate increases on the probability of loan granting (columns 1-3). By contrast, there is no evidence of asymmetry for the intensive margin regressions—neither for new loan volumes nor for loan rates (columns 4-9).<sup>31</sup>

Lags of monetary policy transmission. Another key question concerns the speed of transmission of monetary policy to credit aggregates. Kashyap and Stein (1995) examine this question for U.S. banks, allowing for a lagged effect of the change in the Federal Funds rate up to 8 quarters. For ease of comparison with their results, we estimate our baseline specification with 8 lags of the interbank rate by itself, controlling for GDP growth and inflation (following the specification in Kashyap and Stein (1995), Table 3, p. 175). The results are shown in Table A3 which reports only the coefficient estimates on each lag term (with statistical significance), the sum of the coefficient estimates across the 8 lags (representing the cumulative impact of  $\Delta IR$ ), and the p-value from a Wald test that the sum of the coefficients is equal to 0. The results in Table A3 reveal that the cumulative effect of a monetary tightening over 8 lags is negative and statistically significant for both the extensive and intensive margins of loan adjustment. Across the three specifications considered, the cumulative impact of  $\Delta IR$  on the likelihood of loan granting across 8-quarter lags

 $<sup>^{30}359 \</sup>times (34 - 15) \times 0.0343 = 233.9.$ 

<sup>&</sup>lt;sup>31</sup>A leading factor weighing down on the recovery of bank credit during the easing period were non-performing bank loans that accrued during the tightening period (the ratio of NPLs to gross loans increased from less than 1.9% in 2011:Q2 to more than 6.1% at the beginning of 2014:Q1).

is negative and statistically significant at least at the 10% level. The same cumulative impact on the volume of loans granted is also negative and statistically significant at least at the 20% level.

### 4.4 Robustness

In this section we present several robustness tests relating to (i) additional controls (both at the macro and bank level), (ii) alternative interest rates (including the real interest rate and a measure of monetary policy surprises), and (iii) alternative methodological choices (such as using loan-level data for intensive margin regressions and alternative clustering for the standard errors).

Additional macroeconomic and bank controls. To reduce the likelihood of omitted domestic conditions affecting our results, we consider the following additional controls: the nominal exchange rate, terms of trade, fiscal policy, and economic uncertainty. In Table A4 we add the nominal exchange rate and the change in the terms of trade to selected baseline regressions to account for changes in the external environment that may affect monetary policy transmission during the sample period through a commodity price channel or exchange rate channel. Both variables enter in levels and in interaction with bank capital and liquidity, depending on the specification. Our main results are robust to these additional control variables, with all coefficients on  $\Delta IR$ , *CAPITAL* ×  $\Delta IR$  and *LIQUIDITY* ×  $\Delta IR$  remaining statistically significant and of similar magnitude to the baseline.

In Table A5 we present similar specifications which aim to account for potential interactions between monetary and fiscal policy. Controlling for fiscal policy is important because fiscal dominance and political pressures often constrain monetary policy in developing countries, giving rise to complex interactions between these policies (IMF, 2015). We measure the fiscal policy stance with two variables: the budget balance and public debt issuance (both in % of GDP). Regression estimates on the level fiscal policy variable *FISCAL* are generally positive and statistically significant, indicating that fiscal expansions are associated with more bank credit. However, the inclusion of fiscal policy controls does not affect the impact of the interest rate  $\Delta IR$ . Furthermore, the estimated coefficients on balance sheet interactions with  $\Delta IR$  remain unaffected by the additional controls (which themselves enter the specifications in interaction with bank capital and liquidity).

Next we check that our results are not driven by economic policy uncertainty. Previous studies for the U.S. show that policy uncertainty harms the real economy through the banking channel. Berger, Guedhami, Kim and Li (2018), for instance, document liquidity hoarding and bank credit

retrenchment when policy uncertainty rises. In our context, policy uncertainty is especially relevant given that in 2011 there was not only a significant tightening of monetary policy, but also a change in the monetary policy framework that was accompanied by limited central bank communications (as discussed in Section 4.1). We measure uncertainty with the spread (standard deviation) of GDP forecasts that are published in October of the previous year, April and October of the current year, and April of the following year (first/preliminary GDP data release).<sup>32</sup> The results in Table A6 show that our key coefficient estimates are unaffected by controlling for uncertainty, which itself is associated with less bank credit (on both the extensive and intensive margins) and higher loan rates.

We also rule out the possibility that the bank balance sheet channel is driven by bank attributes other than capital and liquidity. In Table A7 we add to our main specifications, both in levels and in interaction with  $\Delta IR$ , the following bank attributes: bank age (measured as the number of years since establishment), ownership (a dummy variable taking value 1 for foreign banks, 0 for domestic banks), and size (a dummy variable taking value 1 for banks with above-median total assets, 0 otherwise). The results reveal that all coefficients on the terms of interest— $\Delta IR$ , *CAPITAL* ×  $\Delta IR$ , and *LIQUIDITY* ×  $\Delta IR$ —remain statistically significant and of similar magnitude to the baseline. Taken together, the results in Tables A4-A7 suggest that neither macro factors nor bank-level characteristics confound our baseline results.

Alternative interest rates. A possible concern could be that our findings hinge on the specific choice of the 7-day interbank market rate to proxy for the monetary policy stance. This choice assumes a strong interest rate transmission mechanism (from the policy rate to market rates), which may be tenuous in developing countries. In a comprehensive review of the literature, Mishra, Montiel and Spilimbergo (2012) argue that "traditional monetary transmission through market interest rates and market-determined asset prices are weak or nonexistent," mostly due to underdeveloped secondary securities markets. In a recent study, Bulir and Vlcek (2015) challenge this view with a new analysis of the interest rate transmission mechanism along the yield curve based on government paper for 16 emerging markets and low-income countries. The authors document a stronger link from short-term policy and interbank rates to longer-term bond yields in credible IT regimes than in other monetary regimes and argue that well-developed secondary markets are not as important as previously thought. Plotting a series of interest rates in Figure A1, we notice a

 $<sup>^{32}</sup>$ As GDP forecasts are done on a yearly basis, we merge the yearly uncertainty variable with our quarterly data on Q4 and linearly interpolate the GDP forecast spread across the remaining quarters. We also check that our results do not change if we assume the forecast to be constant across quarters within the year (results not reported).

significant degree of co-movement between our measure of monetary policy in Uganda (the 7-day interbank rate), the policy rate introduced in July 2011, the re-discount rate at which banks access liquidity from the central bank,<sup>33</sup> and the 91-day Treasury bill rate. Subsequent to the introduction of a monetary policy rate in July 2011, this co-movement suggests a fair degree of pass-through from the policy rate to market rates. As a robustness check, we run our baseline regressions replacing the interbank rate with each of these alternative interest rates. As seen in Table A8, our main conclusions remain unchanged.<sup>34</sup>

Monetary policy surprises. We supplement our findings with an additional interest rate series which is derived under the assumption that interest-rate setting followed a Taylor (1993)-like rule during the period of analysis with particular focus on the behavior of past inflation and output growth. We construct two measures of monetary policy "surprises" as the residuals from a regression of the 7-day interbank rate on 1-quarter lagged GDP growth and inflation, as well as 1- and 2-quarter lags of these variables. The two regressions are estimated on quarterly time series over the 2009:Q1-2014:Q2 period and yield a good fit, with the  $R^2$  of 27% and 50%. We then use the change in these "Taylor residuals" to replace  $\Delta IR$  in our main specifications. Table A10 shows that the coefficient estimates on the terms of interest are statistically significant in most specifications, and have comparable magnitudes with baseline Tables 3-6.

Clustering of standard errors. We gauge the sensitivity of statistical significance on our main estimates to different assumptions about the correlation structure of errors by allowing for residual correlation within banks (given that the main interactions of interest vary across banks) and within borrowers (given that changes in credit can be correlated across banking relationships and time). As seen in Table A12, we allow for clustering at: borrower, borrower and bank, and borrower, bank and year-quarter level (where the borrower is given by a district-industry pair). The results are broadly robust to these alternative approaches to estimating the standard errors, although the coefficient on  $\Delta IR \times CAPITAL$  in the intensive margin regression is less precisely estimated

<sup>&</sup>lt;sup>33</sup>The re-discount rate is the rate at which commercial banks with a liquidity shortage can sell back their Treasury securities with less than 91 days to maturity to the Bank of Uganda. After the introduction of the policy rate in June 2011, the re-discount rate was pegged to the policy rate with a given margin (of 4 percentage points) set by the Monetary Policy Committee. Before June 2011 the re-discount rate was pegged to the 91-day Treasury bill annualized yield (hence reflecting both market conditions and the monetary policy stance). Therefore we can think of the re-discount rate as in-between a policy and market rate.

<sup>&</sup>lt;sup>34</sup>The interest rate that influences the behavior of economic agents is the real interest rate. In our main specifications, we effectively examine the economic impact of the real (short-term) interest rate by explicitly controlling for inflation in levels and interactions with bank balance sheet variables. However, we can also test for the effect of the real interest rate more directly. To this end, we calculate the real interbank rate (i.e., the nominal 7-day interbank rate adjusted for inflation) and replace it in our main specifications. As seen in Table A9, our main estimates remain quantitatively and statistically significant.

 $(p-value = 0.126, column 6).^{35}$ 

## 5 Monetary policy, real economic activity, and inflation

In this section we further assess the bank lending channel in Uganda by exploring the link between monetary policy and real economic outcomes. To this end, we conduct the analysis at the district level using multiple measures of economic activity (described in Section 3.2). The bank lending channel of monetary policy is effective if short-term rates affect not only market rates and credit aggregates, but also the real sector. This can be expected to occur if firms are bank-dependent and cannot easily switch to alternative forms of financing such as corporate bonds, cross-border loans, or informal lenders. Each of these possibilities is discussed below. The bank balance sheet channel predicts that the impact of monetary policy on real sector outcomes varies with local financial conditions (that is, bank capital and liquidity). We expect a monetary tightening to affect economic activity relatively more in districts where the banking system has less capital and more liquidity, given that those districts also experience a greater credit contraction.

## 5.1 Empirical strategy

The unit of observation in most real effects regressions is a district-quarter. In the inflation regressions it is district-month and in the exports regressions it is district-product-destination-year.

We start by constructing time-varying measures of banking conditions at the district level. To this end, we compute weighted averages of bank capital and liquidity across banks, where the weights are given by the banks' market shares within each district. Market shares are based on the total loan volume granted by each bank per district over the full sample period. Then we estimate a reduced-form specification that that focuses on the bank balance sheet channel, as follows:<sup>36</sup>

$$REAL OUTCOME_{dt} = \psi_{d} + \tau_{t} + \delta_{1}CAPITAL_{d,t-1} + \delta_{2}LIQUIDITY_{d,t-1} + \alpha_{2}\Delta IR_{t-z} \times CAPITAL_{d,t-1} + \alpha_{3}\Delta IR_{t-z} \times LIQUIDITY_{d,t-1} + \beta_{2}\Delta GDP_{t,t-z} \times CAPITAL_{d,t-1} + \beta_{3}\Delta GDP_{t,t-z} \times LIQUIDITY_{d,t-1} + \gamma_{2}\Delta CPI_{t,t-z} \times CAPITAL_{d,t-1} + \gamma_{3}\Delta CPI_{t,t-z} \times LIQUIDITY_{d,t-1} + \epsilon_{dt}$$

$$(3)$$

<sup>&</sup>lt;sup>35</sup>The results are further robust, across all dependent variables, to clustering only on bank and year-quarter. In addition, in the extensive margin regressions we can define the borrower as a single firm and show that the results are robust to clustering at the firm, firm and bank, and firm, bank and year-quarter level (results not reported).

<sup>&</sup>lt;sup>36</sup>In specifications where  $\Delta IR$  enters by itself (similar to the baseline lending regressions in column 1 of Tables 3 and 4), we find insignificant coefficients on  $\Delta IR$  across most real outcomes and lags (results not reported).

where *REAL OUTCOME*<sub>dt</sub> is a measure of economic activity. When these measures are the number of commercial building permits or the number of public demonstrations in district *d* in quarter *t*, we allow monetary policy to have an effect on real economic activity with a transmission lag of up to 4 quarters (z = 1, 2, 3, 4). The change in the 7-day interest rate  $\Delta IR_{t-z}$  enters the specification in level and is lagged by *z* quarters. The bank balance sheet variables are lagged one quarter and their interactions with GDP growth and inflation are also included to avoid confounding effects for our balance sheet interactions with the interest rate. All specifications include district and year-quarter fixed effects. Similar to the credit supply equations, we expect stronger effects in districts with low-capital and highly-liquid banks, i.e.,  $\alpha_2 > 0$  and  $\alpha_3 < 0$ .

When the measure of economic activity is trade, we estimate a similar model in which the dependent variable is the log-transformed volume of exports. Given that the unit of observation is the district-product-destination-year (where destinations are 105 countries and we have 97 product categories), we are able to control for export demand with product×destination×year fixed effects (in the spirit of Paravisini, Rappoport, Schnabl and Wolfenzon, 2015). Finally, for inflation we have monthly data for a small set of districts, so we examine the impact of monetary policy on prices using a slightly modified Equation 3 in which we only control for balance sheet characteristics (capital, liquidity) and their interactions with GDP growth, with district and year-month fixed effects.

Empirical identification hinges on the assumption that firms do not have access to diversified sources of external financing, such as foreign currency loans, corporate bonds, cross-border loans, or informal lenders. The availability of such alternative sources of funds would reduce or even neutralize the impact of fluctuations in bank credit on the real sector. We argue alternative sources of funds are largely unavailable to the vast majority of Ugandan firms. While close to half of total credit from commercial banks is extended in foreign currencies (notably the USD), foreign currency loans are granted almost exclusively to large and creditworthy firms in the manufacturing, trade, and agricultural sectors by a small number of banks. In addition, macroprudential rules require that foreign currency borrowers to large manufacturers or exporting firms. Furthermore, as shown in Table A13, bank credit in USD strongly responds to domestic monetary policy on the extensive margin, casting doubt on the foreign currency loan market acting as a substitute for local currency loans.

In addition, the corporate bond market is still underdeveloped and firms have limited access

to cross-border loans.<sup>37</sup> But access to informal credit is widespread: in developing countries, firms commonly borrow from both formal and informal lenders (Jain, 1999). There are two reasons we believe access to informal credit cannot neutralize the monetary transmission channel. To start with, informal credit incurs sizeable interest rates and transaction costs (Giné, 2011). Therefore, switching to informal lenders would raise firms' cost of external finance, which in turn could hinder profitability and output. In addition, informal lenders tend to be small and capital-constrained (Conning and Udry, 2007), which makes them unlikely to substitute banks as providers of credit to firms.

#### 5.2 Results

Tables 7 and 8 report estimates from our real-effects regressions, which consistently indicate that a monetary policy tightening dampens economic activity and non-food prices relatively more in districts where banks are less well capitalized and—albeit less consistently—more liquid.

Table 7 shows that the effect of monetary policy on economic activity measured by the number of applications for commercial construction permits is statistically significant after one quarter and persists in outer quarters. Across specifications, the coefficient estimates on the interaction terms of the interest rate with bank capital are significant at conventional levels while those for bank liquidity are statistically insignificant. Comparing low- and high-capital districts (90th vs. 10th percentile), a rise of the interest rate by one SD (359 bps) reduces the number of applications for commercial building permits in the following quarter by 12% more in low-capital districts than it does in high-capital districts (columns 1-4).<sup>38</sup>

Turning to the impact of monetary policy on trade, the results in columns 5-6 of Table 7 reveal that export volumes react more to changes in the policy rate in districts with low-capital banks. By including product×destination×year fixed effects, we compare the exports of the same product shipped to the same destination country and in the same year, of firms from districts with high vs. low bank capital and liquidity, thus controlling for time-varying export demand from different destinations. The coefficient magnitudes indicate a differential impact of an increase in short-term rates by one SD on (log) export volumes of 2.4 in high vs. low capital districts, which corresponds to 25% of the average export volume. The results are also robust to excluding exports of raw

<sup>&</sup>lt;sup>37</sup>According to data from Dealogic Loan Analytics, during 2010-2014 only eight syndicated loans were extended to firms in Uganda (out of 667 loans granted to firms in developing countries over the same period).

<sup>&</sup>lt;sup>38</sup>Column 1:  $3.59 \times (34 - 15) \times 0.0063 = 0.43$ , which corresponds to 12% of the average (log) number of building permits (3.46).

materials which may be more responsive to global commodity prices and financing conditions than to domestic monetary policy.

Then, we explore the impact of monetary policy on social unrest using data on public demonstrations. We bring this outcome to the analysis because most corporate loans have variable rates so a change in the policy rate directly affects interest costs and borrowers' debt burden. In addition, there is media coverage of public protests against tight economic conditions—including inflation and high interest rates—during the monetary contraction period;<sup>39</sup> and previous literature shows that tight credit can lead to social instability. As expected, in columns 7-10 of Table 7 we find that for a given increase in interest rates, the number of protests and riots is higher in districts with banks where banks have less capital and more liquid assets. These effects are statistically significant with a 2-, 3- and 4-quarter lag. The coefficient estimates in column 9 indicate that a rise in short-term interest rates by one SD increases the number of demonstrations three quarters later by 0.33 more in low-capital district than in high-capital districts, or 23% of the average number of demonstrations.<sup>40</sup>

Finally, Table 8 presents estimates of the link between monetary policy and non-food inflation and its components with a lag of up to 12 months. For brevity we only show the coefficients for the main interaction terms, which indicate that the effect of short-term rates on inflation is stronger in districts with less bank capital. To gauge the economic magnitude of the effect of bank characteristics, we once again compare low- and high-capital districts (i.e., 10th and 90th percentiles). Looking at the coefficients in column 12, we obtain that an increase by one SD in the short-term rate (1058 bps in the monthly data) reduces non-food inflation 12 months later by almost 3 percentage points (or 32% of the mean) more in low-capital districts than in high-capital districts.<sup>41</sup> The coefficients are statistically significant for utilities and transportation as well, the two main components of the non-food CPI, and the effects are significant already after 2 and 4 months, respectively. By contrast, these effects are negative but imprecisely estimated for bank liquidity.

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<sup>&</sup>lt;sup>39</sup>See, e.g., coverage in several articles published in 2011 in The New York Times, The Guardian, and Reuters.

 $<sup>^{40}</sup>$ Column 9: 3.59 × (34 – 15) × (-0.0016) = 0.11, which is the effect over one quarter. Then, (0.11 × 3)/1.42 = 0.23.  $^{41}$ Column 12: 10.58 × (34 – 15) × (0.0147) = 2.95, which is the effect over 12 months, corresponding to 2.95/9.14 = 32% of average non-food inflation.

## 6 Conclusions

Research on monetary policy using aggregate data documents a weak or nonexistent bank lending channel in developing countries. We revisit this question using the case of Uganda, which provides a supervisory credit register with high-quality information on loan applications and rates, coupled with extensive regional statistics on real sector activity, and largely unanticipated variation in monetary policy during 2010-2014.

We find that a tightening of monetary policy reduces the supply of bank credit to firms and dampens economic activity. We document a significant and sizeable effect of monetary policy on the quantity and price of credit, with adjustments in credit supply on both the extensive and intensive margins. The analysis reveals a quantitatively and statistically significant bank balance sheet channel. The tightening of credit conditions—through higher rejection of loan applications, reduced volume of new loans, and higher loan rates—is stronger for banks with less capital and greater exposure to sovereign debt, even when comparing loans to identical firms borrowing at the same time from different banks. Our credit supply results also imply binding effects of monetary policy on prices and economic activity measured by commercial construction permits, trade, and public demonstrations.

Our study aims to provide a better understanding of the effectiveness of monetary policy in developing countries using microdata. Credit registers, which are increasingly available across the world, offer the opportunity to move away from aggregate time-series analyses of monetary policy, for which identification remains a major challenge, and which historically have provided mixed and inconclusive results. Our results suggest that monetary policy can be an effective macroeconomic tool in developing countries by affecting credit supply and real economic activity. However, more research is needed to understand how banks affect the transmission of monetary policy in countries that experience rapid financial development and changes in monetary policy frameworks.

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### **Figures and tables**

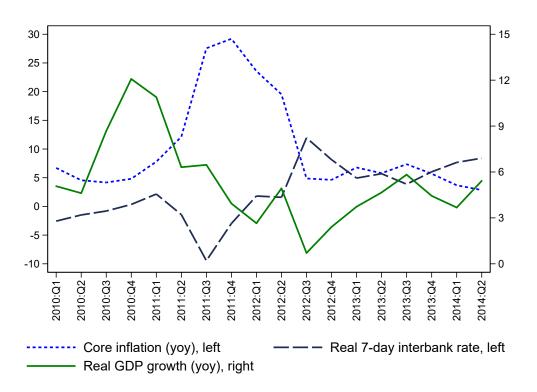


Figure 1: Monetary conditions, real GDP growth, and inflation

Data sources: Bank of Uganda and Uganda Bureau of Statistics.

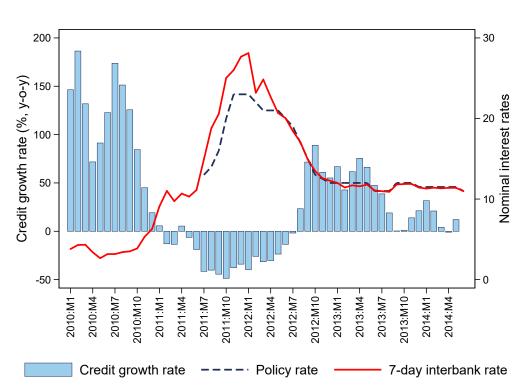


Figure 2: Monetary conditions and credit

Data sources: Bank of Uganda and IMF International Financial Statistics (IFS).

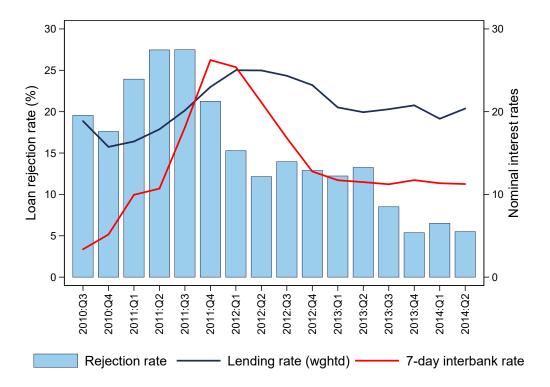


Figure 3: Monetary conditions, loan rejection rate, and average loan rate

Data sources: Bank of Uganda and Compuscan Uganda CRB Ltd.

#### Variable Description Source **Credit Register Data** LOAN GRANTED Dummy variable that takes value 1 for loan applications that are Compuscan Uganda CRB accepted, 0 otherwise. To make coefficients more readable this Ltd. variable is multiplied by 100 NEW LOANS (ln) Amount of new loans (UGX billion). Expressed in real terms Compuscan Uganda CRB using the Uganda CPI (Jan 2010=100) Ltd. LOAN RATE Interest rate on granted loans Compuscan Uganda CRB Ltd. DISTRICT District (location) of the borrower. There are 66 districts Compuscan Uganda CRB Ltd. **INDUSTRY** Sector of activity (industry) of the borrower. There are 9 in-Compuscan Uganda CRB dustries: Agriculture, Mining and Quarrying, Manufacturing, Ltd. Trade, Transport, Communication, Electricity and Water, Building, Construction and Real Estate, Community, Social, and Other Services; and Other Sector (mainly public sector enterprises) Macroeconomic Data IR (7-day interbank rate) Interest rate on interbank market with maturity of 7 days Bank of Uganda Policy rate Bank of Uganda policy rate (central bank rate) introduced in July International Finance Statistics (IFS) 2011. 91-day T-bill rate Interest rate on 91-day Treasury securities. Bank of Uganda Re-discount rate Rate at which banks with a liquidity shortage can borrow from IFS the Bank of Uganda against eligible collateral $\Delta GDP$ Real GDP growth (q-o-q) Bank of Uganda CPI growth (q-o-q) $\Delta CPI$ Bank of Uganda NER Nominal exchange rate (UGX/USD) IFS Terms of trade index. TOTIFS FISCAL, DEFICIT Budget balance, in % of GDP. Bank of Uganda FISCAL, DEBT Public debt issuance, in % of GDP. Bank of Uganda **UNCERTAINTY** Calculations based on GDP forecasts. World Economic Outlook $\Delta CPI, NONFOOD$ Non-food CPI (and its components $\Delta CPI, UTILITIES$ re-Bank of Uganda ferring to housing, electricity, gas and other fuels; and $\Delta CPI, TRANSPORTATION$ ) at the district-month level BUILDING PERMITS Number of commercial building permits applications submitted Uganda Bureau of Statisto local townships, at district-quarter level tics EXPORT VOLUME Volume of exports at the district-product-destination country-Uganda Bureau of Statisyear level. There are 97 product categories to 105 destinations. tics DEMONSTRATIONS Number of organized or spontaneous demonstrations against a Armed Conflict Location public or private institution, at the district-quarter level and Event Data Project (ACLED) **Bank Balance Sheet Data** CAPITAL Total regulatory capital (Tier 1+Tier 2) divided by risk-weighted Bank of Uganda assets LIQUIDITY Ratio of liquid assets to total deposits Bank of Uganda BANK AGE Number of years since bank was established Bank of Uganda LARGE BANK Dummy variable that takes value 1 for banks with above-Bank of Uganda median total assets, 0 otherwise FOREIGN Dummy variable that takes value 1 for banks with majority for-Bank of Uganda

### Table 1: Variable definitions and sources

eign ownership, 0 otherwise

	Obs.	Mean	St. Dev.	p25	p50	p75
Credit register data						
LOAN GRANTED	16,663	83.73	36.90	100.00	100.00	100.00
NEW LOANS (ln)	3,611	18.13	2.35	16.59	18.04	19.70
LOAN RATE	3,377	24.74	6.45	21.00	24.00	28.00
ΔLOAN RATE	1,526	-0.08	6.79	-2.00	0.00	2.03
Macroeconomic variables						
IR (7-day interbank rate)	16,663	13.08	6.04	10.70	11.35	16.82
$\Delta IR$	16,663	1.00	3.59	-0.38	0.29	1.79
Policy rate	11,298	14.68	4.04	11.50	12.50	17.00
91-day T-bill rate	16,663	10.81	3.88	8.94	9.44	13.38
Re-discount rate	16,663	16.97	5.21	14.82	15.50	19.00
$\Delta GDP$	16,663	1.36	1.69	0.21	1.10	2.65
ΔCPI	16,663	2.93	3.48	1.05	1.45	4.17
$\Delta NER$	16,663	-0.99	5.62	-2.75	-1.25	0.94
$\Delta TOT$	16,663	-0.11	0.42	-0.34	-0.21	0.08
FISCAL, DEFICIT	16,663	-3.79	3.24	-5.78	-3.93	-3.05
FISCAL, DEBT	16,663	0.68	3.28	-0.20	0.99	2.94
UNCERTAINTY	16,663	0.51	0.37	0.31	0.33	0.51
Real effects variables						
∆CPI, NONFOOD	372	9.15	5.53	4.94	7.56	13.09
∆CPI,UTILITIES	372	12.31	10.53	4.31	10.27	17.82
∆CPI, TRANSPORTATION	372	10.66	7.44	5.00	8.78	15.98
BUILDING PERMITS (ln)	1,732	3.46	7.00	0.00	0.00	5.00
EXPORT VOLUME (ln)	7,347	9.39	3.41	6.95	9.49	11.86
DEMONSTRATIONS	229	1.42	2.74	0.00	1.00	1.00
Bank characteristics						
CAPITAL	16,491	20.44	6.08	20.01	21.30	24.37
LIQUIDITY	16,491	37.66	9.86	35.76	37.62	42.98
BANK AGE	16,663	36.41	18.47	28.00	29.00	49.00
LARGE BANK	16,663	76.2%	42.6%	-	-	-
FOREIGN	16,663	76.4%	42.5%	-	-	-

### Table 2: Descriptive statistics

*Notes*: The table shows summary statistics for selected regression variables. See Table 1 for variable definitions. Summary statistics for loan applications, macroeconomic variables, and bank balance sheets come from the loan-applications datafile, where the unit of observation is an individual loan application. Summary statistics for loan volumes and rates on granted loans come from the file with loan originations, where the data are aggregated at the bank-firm cluster-quarter level, where a cluster includes all firms in a district-industry pair (see Section 4.1 for details). The period of analysis is 2010:Q3–2014:Q2. The two *FISCAL* variables are budget deficit and public debt issuance, respectively (both divided by GDP). Bank capital and liquidity are winsorized at the 1st and 99th percentiles of the capital and liquidity distributions.

	LOAN GR				
	(1)	(2)	(3)	(4)	(5)
$\Delta IR$	-0.7877*** (0.119)	-0.5548*** (0.104)	-0.3437*** (0.098)		
$\Delta IR \times CAPITAL$	(0.11))	(0.101)	(0.090)	0.0721***	0.1146**
$\Delta IR \times LIQUIDITY$				(0.015) -0.0362** (0.014)	(0.047) -0.0619*** (0.019)
ΔGDP		0.9392***	0.8214***	· · ·	( )
ΔCPI		(0.194) -0.6320*** (0.172)	(0.191) -0.3754*** (0.138)		
CAPITAL		. ,	0.8511***	0.4825***	0.7836***
LIQUIDITY			(0.174) 0.3521*** (0.095)	(0.076) 0.4336*** (0.052)	(0.234) 0.3020** (0.128)
$\Delta GDP  imes CAPITAL$			(0.070)	-0.2142***	-0.0607
$\Delta GDP \times LIQUIDITY$				(0.026) -0.0055 (0.025)	(0.055) 0.0393 (0.031)
$\Delta CPI \times CAPITAL$				0.0580**	-0.0444
$\Delta CPI \times LIQUIDITY$				(0.022) 0.0205*** (0.006)	(0.027) 0.0176 (0.015)
Observations	13,870	13,870	13,765	15,714	8,305
$R^2$	0.403	0.405	0.411	0.276	0.568
Firm FE	Yes	Yes	Yes		
Bank FE District-industry $ imes$ year-quarter FE	Yes	Yes	Yes	Yes Yes	Yes
Firm × year FE				165	Yes

Table 3: Extensive margin of credit supply (Loan application accepted)

*Notes*: The dependent variable is *LOAN GRANTED* and takes value 100 (to make coefficients easier to read) for loan applications that are accepted, and 0 otherwise. The unit of observation is an individual loan application. Column 4 has more observations compared to columns 1-3 because the fixed effects (even if time-varying) are less demanding (District-industry  $\times$  year-quarter FE compared to Firm FE) and hence fewer singletons drop out. Column 5 has the lowest number of observations among all regressions due to the most demanding fixed effects (Firm  $\times$  year FE) triggering the highest number of singletons. All macro variables are defined as changes between quarter t - 1 and t and all balance sheet variables are lagged 1 quarter. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	NEW LOA (1)	(2)	(3)	(4)	(5)
		(-)	(0)	(1)	(0)
$\Delta IR$	-0.0158*** (0.003)	-0.0314*** (0.006)	-0.0223*** (0.008)		
$\Delta IR \times CAPITAL$	(0.000)	(0.000)	(0.000)	0.0039***	$0.0046^{***}$
$\Delta IR \times LIQUIDITY$				(0.001) -0.0022*** (0.001)	(0.002) -0.0031*** (0.001)
ΔGDP		0.0821***	0.0684***	(0.001)	(0.001)
ΔCPI		(0.021) 0.0180* (0.009)	(0.020) 0.0167** (0.008)		
CAPITAL		(0.009)	(0.008) 0.0473*** (0.010)	0.0268 (0.031)	0.0343 (0.027)
LIQUIDITY			0.0174***	0.0015	0.0099
$\Delta GDP \times CAPITAL$			(0.004)	(0.008) 0.0015	(0.013) 0.0012
$\Delta GDP \times LIQUIDITY$				(0.002) 0.0004	(0.003) -0.0002
$\Delta CPI \times CAPITAL$				(0.001) -0.0022	(0.002) -0.0014
$\Delta CPI \times LIQUIDITY$				(0.002) 0.0027*** (0.001)	(0.002) 0.0016 (0.001)
Observations	3,563	3,563	3,563	2,652	5,438
$R^2$	0.418	0.423	0.431	0.529	0.760
Bank FE	Yes	Yes	Yes	Yes	Yes
District-industry FE District-industry × year-quarter FE	Yes	Yes	Yes	Yes	
Firm $\times$ year FE				105	Yes

Table 4: Intensive margin of credit supply (New loan volumes)

*Notes*: The dependent variable is the (log-transformed) loan amount *NEW LOANS* (*ln*) for new loans. In columns 1-4 we take the average of loan amounts within firm cluster, where a cluster refers to all firms in a given district and industry, so the unit of observation is bank-firm cluster-quarter. Column 4 has fewer observations than columns 1-3 due to more demanding fixed effects (District-industry × year-quarter FE compared to District-industry FE). In column 5 the data is set up differently from previous columns, in particular we take the average of loan amounts granted by each bank to a firm in a given quarter, so the unit of observation is bank-firm-quarter. As the data structure is more granular, column 5 has more observations than columns 1-4. All macro variables are defined as cumulative changes between quarter t - 2 and t and bank balance sheet variables are lagged 2 quarters (see Section 4 for details). Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	LOAN GRA	ANTED	NEW LOAI	NS(ln)
	(1)	(2)	(3)	(4)
$\Delta IR \times LIQUIDITY \times HIGH MORAL SUASION$ [1]	-0.0708***	-0.0236**	-0.0046***	-0.0062***
$\Delta IR \times LIQUIDITY \times LOW MORAL SUASION$ [2]	(0.018) -0.0418***	(0.011) 0.0111 (0.008)	(0.001) -0.0022*** (0.001)	(0.001) -0.0036***
	(0.015)	(0.008)	(0.001)	(0.001)
Observations	15,714	8,305	2,652	5,438
$R^2$	0.277	0.528	0.539	0.764
p-value Wald test Ho: coeff. [1]> coeff. [2]	0.500	0.457	0.483	0.519
Bank controls	Yes	Yes	Yes	Yes
Interactions with GDP and CPI	Yes	Yes	Yes	Yes
Bank capital $\times \Delta IR$	Yes	Yes	Yes	Yes
Bank FE	Yes	Yes	Yes	Yes
District-industry $\times$ year-quarter FE	Yes	-	Yes	-
Firm $\times$ year FE		Yes		Yes

#### Table 5: Heterogeneity in the liquidity effect—Moral suasion

*Notes*: This table examines heterogeneity in the liquidity effect of monetary policy for banks that are subject to varying degrees of moral suasion. The dependent variables are *LOAN GRANTED* in columns 1-2 and the volume of new loans *NEW LOANS* (*ln*) in columns 3-4. The specifications correspond to baseline regressions in columns 4-5 of Table 3 and 4, respectively, with the difference that we apply a spline for high vs. low moral suasion banks to the interaction term  $\Delta IR \times LIQUIDITY$ . We define banks subject to high/low moral suasion as those with above/below mean number of loan applications from the public sector. All controls and lag structure as in the baseline specifications. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

Table 6: Loan rates

	$\Delta LOAN F$	RATE			
	(1)	(2)	(3)	(4)	(5)
$\Delta IR$	0.3343*** (0.035)	0.4877*** (0.039)	0.4722*** (0.039)		
$\Delta IR \times CAPITAL$	× ,	. ,	· · ·	-0.0343***	-0.0252
$\Delta IR \times LIQUIDITY$				(0.008) 0.0239*** (0.005)	(0.023) 0.0295* (0.012)
$\Delta GDP$		-0.4024*** (0.103)	-0.3401*** (0.113)	(0.003)	(0.012)
ΔСΡΙ		-0.2059*** (0.055)	-0.2477*** (0.065)		
CAPITAL			-0.0117 (0.044)	0.0380 (0.055)	0.0075 (0.122)
LIQUIDITY			(0.011) -0.0845*** (0.018)	-0.1057*** (0.017)	-0.0839 (0.068)
$\Delta GDP \times CAPITAL$			(0.010)	0.0421***	(0.008) (0.0043) (0.030)
$\Delta GDP \times LIQUIDITY$				(0.008) -0.0001 (0.006)	-0.0092
$\Delta CPI \times CAPITAL$				(0.006) -0.0009	(0.016) -0.0082
$\Delta CPI \times LIQUIDITY$				(0.010) -0.0003 (0.008)	(0.014) 0.0005 (0.008)
Observations $R^2$	1,516 0.089	1,516 0.103	1,516 0.109	1,066 0.196	2,052 0.562
Bank FE District-industry FE	Yes Yes	Yes Yes	Yes Yes	Yes	Yes
District-industry $\times$ year-quarter FE Firm $\times$ year FE				Yes	Yes

*Notes*: The dependent variable is the change in the interest rate charged on granted loans  $\Delta LOAN RATE$ . To be able to calculate this change, in columns 1-4 we calculate the average loan rates within firm cluster, that is, across loans granted to firms in a given district and industry. Therefore, in columns 1-4 the data is at the bank-firm cluster-quarter level. (Note that the number of observations is significantly lower in this table compared to Table 4 due to the loan rate missing on some loans, as per the descriptive statistics in Table 2; and the dependent variable being specified in changes). Column 4 has fewer observations than columns 1-3 due to more demanding fixed effects (District-industry × year-quarter FE compared to District-industry FE). In column 5 the loan rate is averaged across loans granted by a given bank to a given firm each year so the data is at the bank-firm-year level. This granular data structure leads column 5 to have more observations than columns 1-4. Furthermore, to preserve sample size, in column 5 we calculate the change in the loan rate to a given firm relative to last period's average loan rate for the *cluster* to which the firm belongs. All macro variables are defined as changes between quarter t - 1 and t and all balance sheet variables are lagged 1 quarter. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

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Table 7:

	(1) ln(BUILD	(1) (2) (3) <i>ln</i> ( <i>BUILDINGPERMITS</i> )	(3) <i>ITS</i> )	(4)	(5) <i>ln</i> ( <i>EXPO</i>	(5) (6) In(EXPORT VOLUME)	(7) DEMON	(7) (8) DEMONSTRATIONS	(9) IS	(10)
Quarters over which $\Delta IR$ is lagged	z=1	z=2	z=3	z=4	z=0	z=0	z=1	z=2	z=3	z=4
$\Delta IR  imes CAPITAL$	0.0063***	0.0035**	0.0036***	0.0019*	0.0355*	0.0347*	-0.0010	-0.0008*	-0.0016**	-0.0009**
AIR × LIQUIDITY	(0.002) -0.0023**	(0.002) -0.0014*	(0.001) -0.0014**	(0.001) -0.0007	(0.019) -0.0017	(0.019) -0.0024	(0.001) $0.0021^{*}$	(0.000) $0.0016^{**}$	(0.001) 0.0039*	(0.000) $0.0021^{**}$
	(0.001)	(0.001)	(0.001)	(0.001)	(0.008)	(0.008)	(0.001)	(0.001)	(0.002)	(0.001)
Bank controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Interactions with $\Delta GDP$ and $\Delta CPI$	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Observations	1,386	1,320	1,254	1,188	7,347	6,459	1,386	1,320	1,254	1,188
$R^2$	0.081	0.088	0.098	0.109	0.035	0.037	0.009	0.020	0.016	0.015
Number of districts	<b>6</b> 6	<b>6</b> 6	<b>6</b> 6	<b>6</b> 6	18	18	99	<b>6</b> 6	99	<b>6</b> 6
Include exports of raw materials					Yes	No				
District FE	Yes	Yes	Yes	Yes			Yes	Yes	Yes	Yes
Year-quarter FE	Yes	Yes	Yes	Yes			Yes	Yes	Yes	Yes
Product×destination×year FE					Yes	Yes				

at district-quarter level. The regressions allow for a lagged impact of up to 4 quarters (z = 1, 2, 3, 4, columns 1-4 and 7-10) or a contemporaneous impact (z = 0, columns 5-6) of the interest rate  $\Delta IR$  and other macro variables, indicated as column headings. All regressions include the control variables from Equation 3, namely bank balance sheet variables CAPITAL and LIQUIDITY and their interactions with CPI and GDP growth (coefficients not shown). Bank balance sheet variables CAPITAL and LIQUIDITY and their interactions with CPI and GDP growth (coefficients not shown). Bank balance sheet variables CAPITAL and LIQUIDITY and their interactions with CPI and GDP growth (coefficients not shown). Bank balance sheet variables CAPITAL and LIQUIDITY and their interactions with CPI and GDP growth (coefficients not shown). Bank balance sheet variables CAPITAL and LIQUIDITY, lagged 1 quarter, are computed as weighted averages of bank capital and liquidity at the district level, where the weights are given by banks' market share in total local currency lending in each district over the sample period. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	(1) z=1	(2) z=2	(3) z=3	(4) z=4	(5) z=5	(6) z=6	(7) z=7	(8) z=8	(9) z=9	(10) $z=10$	(11) z=11	(12) z=12
<b>ΔCPI, NONFOOD</b>												
CAPITAL × ΔIR LIQUIDITY × ΔIR	-0.0061 (0.005) -0.0026 (0.002)	-0.0039 (0.005) -0.0029 (0.003)	-0.0024 (0.005) -0.0028 (0.003)	0.0012 (0.005) -0.0029 (0.003)	0.0032 (0.005) -0.0022 (0.003)	0.0058 (0.005) -0.0029 (0.003)	0.0087* (0.005) -0.0029 (0.002)	0.0075* (0.004) -0.0024 (0.002)	0.0087** (0.004) -0.0022 (0.002)	0.01111*** (0.004) -0.0014 (0.002)	0.0118*** (0.003) -0.0016 (0.002)	0.0147*** (0.004) -0.0010 (0.002)
$R^2$	0.912	0.911	0.913	0.915	0.915	0.915	0.917	0.920	0.922	0.925	0.926	0.928
<b>ΔCPI, UTILITIES</b>												
CAPITAL × ΔIR LIQUIDITY × ΔIR	0.0195 (0.021) 0.0012 (0.011)	0.0330* (0.020) 0.0015 (0.010)	0.0506** (0.020) -0.0011 (0.010)	0.0613*** (0.020) -0.0061 (0.010)	0.0722*** (0.019) -0.0064 (0.010)	0.0808*** (0.019) -0.0118 (0.010)	0.0827*** (0.018) -0.0126 (0.009)	0.0733*** (0.017) -0.0124 (0.008)	0.0634*** (0.017) -0.0061 (0.007)	0.0607*** (0.015) -0.0022 (0.007)	0.0529*** (0.015) -0.0002 (0.006)	0.0567*** (0.016) 0.0002 (0.007)
$R^2$	0.640	0.643	0.653	0.662	0.666	0.669	0.673	0.675	0.681	0.696	0.696	0.705
<b>ΔCPI, TRANSPORTATION</b>	TATION											
CAPITAL × ΔIR LIQUIDITY × ΔIR	-0.0165 (0.015) 0.0012 (0.008)	0.0005 (0.015) -0.0013 (0.008)	0.0172 (0.015) -0.0021 (0.008)	0.0370** (0.015) -0.0028 (0.008)	0.0476*** (0.015) -0.0015 (0.008)	0.0571*** (0.015) -0.0018 (0.008)	0.0711*** (0.015) -0.0020 (0.008)	0.0799*** (0.014) -0.0030 (0.007)	0.0837*** (0.013) -0.0047 (0.006)	0.0890*** (0.013) -0.0033 (0.006)	0.0915*** (0.013) -0.0044 (0.006)	0.0949*** (0.012) -0.0021 (0.006)
$R^2$	0.477	0.475	0.485	0.500	0.506	0.512	0.533	0.549	0.563	0.579	0.589	0.597
Observations	356	356	364	372	372	372	365	358	351	344	337	330
District FE Year-month FE	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes

Table 8: Inflation

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Electronic copy available at: https://ssrn.com/abstract=2985006

# **Online Appendix (not for publication)**

# A-I Additional figures and tables

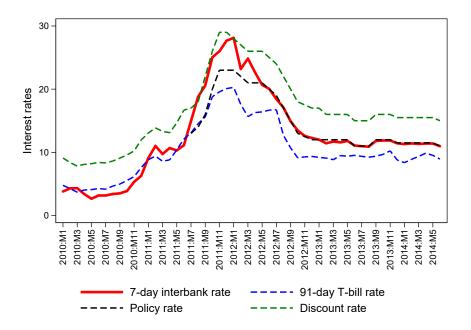


Figure A1: Interest rates

Data sources: Bank of Uganda.

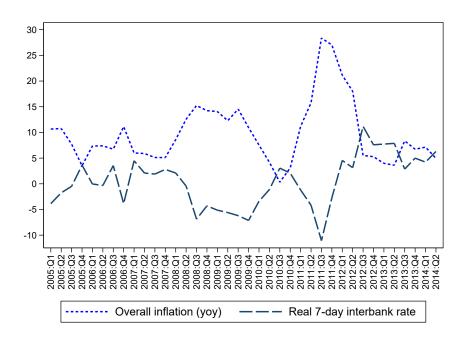


Figure A2: Monetary conditions and inflation, 2005-2014

Data sources: Bank of Uganda.

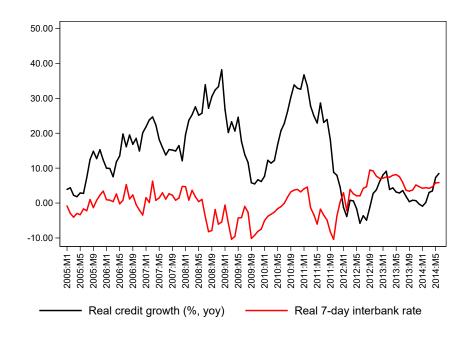
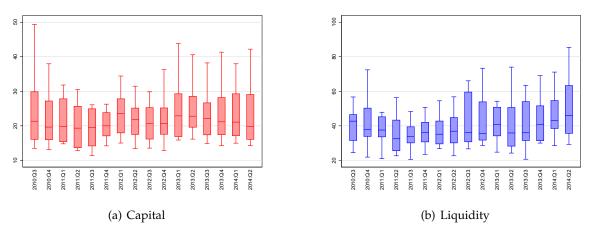


Figure A3: Monetary conditions and credit growth, 2005-2014

Data sources: Bank of Uganda.

### Figure A4: Bank capital and liquidity



*Notes*: Bank capital is the ratio of total regulatory capital (Tier 1 + Tier 2) to total risk-weighted assets (Panel A). Bank liquidity is the ratio of liquid assets to total deposits (Panel B). *Data sources*: Bank of Uganda.

Lag structure for explanatory macro variables:	1-quarter lag (1)	ag (2)	(3)	(4)	Average of (5)	Average of 1- and 2-quarter lags (5) (6) (7)	er lags (7)	(8)
ΔIR ΔIR × CAPITAL ΔIR × LIQUIDITY	-0.0059 (0.007)	-0.0195* (0.010)	-0.0116 (0.009)	0.0055*** (0.002) -0.0038*** (0.001)	-0.0142*** (0.005)	-0.0355*** (0.008)	-0.0284*** (0.008)	0.0071*** (0.002) -0.0045*** (0.001)
Observations R <sup>2</sup>	3,540 0.417	3,540 0.422	3,510 0.427	5,438 0.758	3,540 0.418	3,540 0.424	3,477 0.430	5,438 0.761
Macro controls Bank controls Interactions with $\Delta GDP$ and $\Delta CPI$		Yes	Yes Yes	- Yes Yes		Yes	Yes Yes	- Yes Yes
Bank FE District-industry FE District-industry × year-quarter FE	Yes Yes	Yes Yes	Yes Yes	Yes - Yes	Yes Yes	Yes Yes	Yes Yes	Yes - Yes
<i>Notes</i> : This table provides a rationale for the choice of lag structure in the intensive margin regressions (Table 4). The dependent variable is the (log-transformed) loan amount <i>NEW LOANS (1n)</i> for new loans and the specifications correspond to columns 1-4 in Table 4, where all macro variables were defined as cumulative changes between quarter $t - 2$ and $t$ and bank balance sheet variables were lagged 2 quarters. Here, in columns 1-4 macro variables are defined as changes between quarter $t - 2$ and $t$ and bank balance sheet variables were lagged 2 quarters. Here, in columns 1-4 macro variables are defined as changes between quarter $t - 1$ and $t$ and bank balance sheet variables are lagged 1 quarter. In columns 5-8 macro variables are defined as changes between the first and second quarter lags, and the bank balance sheet variables are lagged 2 quarters. Here, in a verage of changes between the first and second quarter lags, and the bank balance sheet variables are lagged 2 quarters. Here, in a sthe average of changes between the first and second quarter lags, and the bank balance sheet variables are lagged 2 quarters. Standard errors, clustered at the district level, are reported in parentheses. * significant at 10%, *** significant at 5%, *** significant at 1%.	of lag structure is correspond i iarters. Here, ii e defined as th are reported in	e in the intensi to columns 1-4 m n columns 1-4 m e average of ch parentheses. *	ve margin reg in Table 4, wh lacro variables anges between significant at 1	essions (Table 4). ere all macro varia are defined as chan the first and secon 1%; ** significant a	The dependent tbles were define ages between qua d quarter lags, ar t 5%, *** significal	variable is the d as cumulative tret $t - 1$ and $t$ and $t$ and $t$ and $t$ and $t$ and t and t at 1%.	(log-transforme : changes betwe und bank balanc unce sheet varial	d) loan amount en quarter $t - 2$ e sheet variables bles are lagged 2

Table A1: Intensive margin of credit supply (New loan volumes)—Alternative lags

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	LOAN GR (1)	ANTED (2)	(3)	NEW LOANS (ln) (4) (5)	(5)	(9)	ΔLOAN RATE (7) (8)	ATE (8)	(6)
$\Delta IR  imes Tightening period$	-1.1569*** /0.175/	-0.9057***	-0.4109***	-0.0181***	-0.0687***	-0.0432**	0.2714***	0.4721***	0.4249***
$\Delta IR  imes  ext{Easing period}$	(0.1016 0.1016	(0.1293 0.1293	-0.2305	-0.0098*	-0.0197***	(0.021) -0.0157***	(0.070) 0.4131***	(u.uoo) 0.4435***	(0.105) 0.4867***
	(0.148)	(0.152)	(0.165)	(0.005)	(0.005)	(0.005)	(0.057)	(0.058)	(0.072)
Observations	13,870	13,870	13,765	3,563	3,563	3,563	1,516	1,516	1,516
$R^2$	0.404	0.406	0.411	0.418	0.424	0.431	0.082	0.096	0.101
p-value t-test Ho: No asymmetry	0.000	0.000	0.000	0.309	0.004	0.152	0.202	0.795	0.680
Macro controls		Yes	Yes		Yes	Yes		Yes	Yes
Bank controls			Yes			Yes			Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Firm FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Table A2: Asymmetric effects of monetary policy

- υ, αιω μιε στιαιge in the average toan rate ΔLOAN RATE in columns 7-9. The specifications correspond to baseline regressions in columns 1-3 of Tables 3, 4, and 6, respectively, with the difference that we apply to the ΔIR term a spline for the periods of monetary tightening and easing. The tightening period is 2010:Q3-2011:Q4 and the easing period is 2012:Q1-2014;Q2. All controls and lag structure as in the baseline specifications. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%, \*\* significant at 5%, \*\*\* significant at 1.0%.

	Danal A I			,		5		0	IIInc	4
	Fanel A. L	Panel A. LUAN GKAN I EU	I EU							
No controls	-1.1871*** 0.0299 -0.4190 -0.4026	0.0299	-0.1651 0.7509	-0.0897	-0.1334* 0.2557	-0.5764*** _0 800/1***	-0.0113	-0.3429*** 0.0538	-2.476 -1 292	0.0000
	0/17.0-	0064.0-	6007.0	#76C.0-	1007.0	+000'0-	0070-0-	00000	767.1-	CT CO O
	Panel B. N	Panel B. NEW LOANS (1n)	(11)							
No controls	0.0207	-0.0746***	0.0216	0.0049	-0.0136	-0.0207*	-0.0295***	0.0194	-0.0717	0.0718
Macro controls	-0.0667	0.0163	-0.0641	$0.0613^{**}$	-0.0571*	-0.0068	-0.0272***	-0.0017	-0.146	0.101

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of the initial to Kashyap and Stein, 1995, page 175, Table 3). The coefficients on the macro controls on the macro controls not shown. The last two columns report the sum of coefficients across the 8 lags and the p-value of a t-test of the null hypothesis that the sum of coefficients across the 8 lags is equal to 0. The change in the interest rate for k = 1 is defined as  $\Delta I R^{t-k+1} - \Delta I R^{t-k}$ . Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%. e C s

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	(T	(2)	(3)	(4)	(c)	(5) (6)	(2)	(8)	(9) (10)	(10)	(11)	(12)
ΔIR -C (( ΔNER 0.	-0.3514*** (0.130) 0.0064		-0.3253*** (0.099)		-0.0075 (0.017) -0.0151		-0.0210** (0.008)		0.4427*** (0.058) 0.0059		0.4241*** (0.062)	
00 (10 محمد	(0.089)		0.8394		(0.011)		0.0716		(0.026)		-0.8450**	
$\Delta IR  imes CAPITAL$		0.0456**	(+co.0)	0.0729***		0.0038**	(0/0.0)	0.0034***		-0.0388***	(175.0)	-0.0333***
ΔΙR × LIQUIDITY		(0.013) -0.0232* (0.013)		(0.013) -0.0337** (0.013)		(0.002) -0.0023** (0.001)		(0.001) -0.0017** (0.001)		(0.008) 0.0263*** (0.008)		(0.007) 0.0226*** (0.005)
Observations $13$ $R^2$ $0.$	13,765 0.411	15,714 0.276	13,765 0.411	15,714 0.276	3,563 0.431	2,652 0.533	3,563 0.431	2,652 0.533	1,516 0.101	1,066 0.194	$1,516 \\ 0.104$	1,066 0.195
Macro controls	Yes	,	Yes	,	Yes	1	Yes		Yes	,	Yes	
Bank controls Y	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Interactions with $\Delta GDP$ and $\Delta CPI$ Interactions with $\Delta NER$		Yes Yes		Yes		Yes Yes		Yes		Yes Yes		Yes
Interactions with $\Delta TOT$				Yes				Yes				Yes
	Yes		Yes									
	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
District-industry FE District-industry × year-q FE		- Yes		- Yes	Yes	- Yes	Yes	- Yes	Yes	- Yes	Yes	- Yes

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	LOAN GRANTED	ANTED			NEW LO	NEW LOANS (ln)			<b>ΔLOAN RATE</b>	ATE		
Fiscal policy measure:	Deficit (% GDP) (1) (2)	3DP) (2)	Public debt (% GDP) (3) (4)	t (% GDP) (4)	Deficit (% GDP) (5) (6)	, GDP) (6)	Public deb (7)	Public debt (% GDP) (7) (8)	Deficit (% GDP) (9) (10)	GDP) (10)	Public debt (% GDP) (11) (12)	(% GDP) (12)
ΔΙR FISCAL ΔΙR × CAPITAL ΔΙR × LIQUIDITY	-0.3192*** (0.091) 0.4107*** (0.154)	0.0695*** (0.015) -0.0335** (0.016)	-0.3296*** (0.090) 0.2467* (0.140)	0.0695*** (0.015) -0.0342** (0.016)	-0.0192*** (0.009) -0.0158 (0.011)	0.0047*** (0.002) -0.0020** (0.001)	-0.0209** (0.008) -0.0155 (0.012)	0.0039** 0.001) 0.001/7** 0.001)	0.4640*** (0.065) 0.0948 (0.096)	-0.0348*** (0.007) 0.0271*** (0.005)	0.4631*** (0.057) 0.1349** (0.062)	-0.0354*** (0.007) 0.0261***
Observations R <sup>2</sup>	13,765 0.407	15,714 0.277	13,765 0.406	15,714 0.277	3,563 0.431	2,652 0.534	3,563 0.431	2,652 0.534	1,516 0.102	1,066 0.197	1,516 0.103	1,066 0.197
Macro controls Bank controls Interactions with $\Delta GDP$ and $\Delta CPI$ Interactions with $FISCAL$	Yes Yes	- Yes Yes	Yes Yes	- Yes Yes	Yes Yes	- Yes Yes	Yes Yes	- Yes Yes	Yes Yes	- Yes Yes	Yes Yes	- Yes Yes
Firm FE Bank FE District-industry FE District-industry × year-q FE	Yes Yes	Yes - Yes	Yes Yes	Yes - Yes	Yes Yes	Yes - Yes	Yes Yes	Yes - Yes	Yes Yes	Yes - Yes	Yes Yes	Yes - Yes
<i>Notes</i> : This table explores the robustness of selected baseline results to controlling for fiscal policy ( <i>FISCAL</i> ). The dependent variables are <i>LOAN GRANTED</i> in columns 1-4, <i>NEW LOANS</i> ( <i>In</i> ) in columns 5-8, and <i>ALOAN RATE</i> in columns 9-12. We use two measures for fiscal policy: budget balance (% GDP, <i>FISCAL</i> , <i>DEFICIT</i> ) and public debt is-	stness of selec and $\Delta LOAN$	ted baseline <i>RATE</i> in col	results to c umns 9-12.	ontrolling for We use two n	fiscal policy neasures for	(FISCAL). fiscal policy:	The depenc budget bal	s to controlling for fiscal policy ( <i>FISCAL</i> ). The dependent variables are <i>LOAN GRANTED</i> in columns 1-4, 9-12. We use two measures for fiscal policy: budget balance (% GDP, <i>FISCAL</i> , <i>DEFICIT</i> ) and public debt is-	are LOAN G FISCAL, DE	<i>RANTED</i> in <i>FICIT</i> ) and <sub>F</sub>	columns 1-4 د مالاند مالال	

suance (% GDP, *FISCAL*, *DEBT*), indicated as column headings. For each dependent variable, the fiscal policy controls enter in level (odd-numbered columns) or interacted with bank capital and liquidity (even-numbered columns). All controls and lag structure as in the baseline specifications. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	LOAN GR	RANTED	NEW LOA	ANS (ln)	ΔLOAN R	ATE
	(1)	(2)	(3)	(4)	(5)	(6)
ΔIR	-0.4259*** (0.107)		-0.0303*** (0.007)		0.4874*** (0.059)	
UNCERTAINTY	-3.5880* (1.838)		-0.3223*** (0.101)		(0.597) 1.6927*** (0.597)	
$\Delta IR \times CAPITAL$	(1.600)	0.0812*** (0.017)	(0101)	0.0037** (0.001)	(0.037)	-0.0331*** (0.008)
$\Delta IR \times LIQUIDITY$		-0.0373* (0.020)		-0.0015 (0.001)		0.0163** (0.006)
Observations $R^2$	13,765 0.406	15,714 0.277	3,563 0.432	2,652 0.534	1,516 0.102	1,066 0.197
Macro controls	Yes	_	Yes	_	Yes	_
Bank controls	Yes	Yes	Yes	Yes	Yes	Yes
Interactions with $\triangle GDP$ and $\triangle CPI$		Yes		Yes		Yes
Interactions with UNCERTAINTY		Yes		Yes		Yes
Firm FE	Yes	-				
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry $ imes$ year-q FE		Yes		Yes		Yes
District-industry FE			Yes	-	Yes	-

#### Table A6: Robustness—Control for uncertainty

*Notes*: This table explores the robustness of selected baseline results to controlling for uncertainty (*UNCERTAINTY*). The dependent variables are *LOAN GRANTED* in columns 1-2, *NEW LOANS* (*ln*) in columns 3-4, and  $\Delta LOAN RATE$  in columns 5-6. The variable *UNCERTAINTY* is defined as the spread (standard deviation) of yearly GPD forecasts from the IMF's World Economic Outlook (WEO) for four WEO vintages: (GDP forecast in) October of previous year, April and October of current year, and April of following year (first/preliminary data release). We merge this yearly variable with the credit register data on a quarterly basis (on Q4) and linearly interpolate the series across the remaining quarters (within year). For each dependent variable, Uncertainty enters in level (odd-numbered columns) or interacted with bank capital and liquidity (even-numbered columns). All controls and lag structure as in the baseline specifications. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	LOAN G	LOAN GRANTED (1) (2)	(3)	(4)	NEW LOANS (In) (5) (6)	(11) SN (6)	(2)	(8)	ΔLOAN RATE (9) (10	ATE (10)	(11)	(12)
ΔIR × CAPITAL ΔIR × LIQUIDITY ΔIR × BANK AGE ΔIR × FOREIGN	0.0721*** (0.015) -0.0362** (0.014)	0.0857*** (0.021) -0.0583*** (0.015) 0.0237*** (0.003)	0.0296* (0.017) -0.0222* (0.013) -0.9183*** (0.114)	0.0571*** (0.014) -0.0229 (0.015)	0.0040** (0.001) -0.0026*** (0.001)	0.0050*** (0.001) -0.0041*** (0.001) 0.0016***	0.0044*** (0.002) -0.0028*** (0.001) 0.0080 (0.039)	0.0040*** (0.001) -0.0025*** (0.001)	-0.0368*** (0.007) 0.0256*** (0.005)	-0.0405*** (0.007) 0.0303*** (0.004) -0.0047*** (0.001)	-0.0438*** (0.006) 0.0278*** (0.004) -0.3440**** (0.063)	-0.0400*** (0.007) 0.0329*** (0.006)
$\Delta IR  imes LARGE BANK$				-0.7484*** (0.143)				-0.0010 (0.026)				-0.1185* (0.064)
Observations R <sup>2</sup>	15,714 0.276	15,71 <del>4</del> 0.278	$15,714 \\ 0.277$	$15,714 \\ 0.277$	2,652 0.535	2,652 0.538	2,652 0.536	2,652 0.536	1,066 0.202	1,066 0.210	1,066 0.207	1,066 0.206
Bank controls Interactions with $\Delta GDP$ and $\Delta CPI$	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes
Bank FE District-industry $\times$ year-q FE	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes	Yes Yes
<i>Notes</i> : This table examines the robustness of baseline results to controlling for additional bank characteristics (in levels and interactions with $\Delta IR$ ). The dependent variables are <i>LOAN GRANTED</i> in columns 1-4, <i>NEW LOANS (1n)</i> in columns 5-8, and $\Delta LOAN RATE$ in columns 9-12. The additional bank controls are bank age <i>BANK AGE</i> (number of years since establishment), a dummy variable that takes value 1 for foreign banks <i>FORE1GN</i> , and a dummy variable that takes value 1 for banks with total assets above the sample median <i>LARGE BANK</i> . All controls and lag structure as in the baseline regressions. Standard errors, clustered at the district level, are reported in parentheses. * significant at 10%; ** significant at 5%; *** significant at 1%.	stness of bas JEW LOAN ole that takes structure as i	seline results $S(ln)$ in coluts $s$ value 1 for $f$ n the baseline	to controlling mns 5-8, and oreign banks regressions. !		l bank charact in columns 9 d a dummy ve , clustered at t	eristics (in le -12. The addi uriable that ta he district lev	vels and inte tional bank c kes value 1 fi el, are report	$\xi$ for additional bank characteristics (in levels and interactions with $\Delta IR$ ). The dependent variables are $\Delta LOAN$ RATE in columns 9-12. The additional bank controls are bank age $BANK$ AGE (number of years FOREIGN, and a dummy variable that takes value 1 for banks with total assets above the sample median Standard errors, clustered at the district level, are reported in parentheses. * significant at 10%; ** significant	<i>ΔIR</i> ). The de c age <i>BANK ,</i> age <i>BANK ,</i> ottal assets abo ottal assets abo es. * significar	pendent vari 4 <i>GE</i> (number we the sample nt at 10%; ** si	ables are t of years e median gnificant	

Table A7: Robustness—Control for additional bank characteristics

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	Policy rate (1)	(2)	<b>91-day T-E</b> (3)	Gill rate (4)	<b>Re-discou</b> (5)	nt rate (6)
	Panel A. L(	DAN GRANT	ED			
$\Delta IR$	-0.5623*** (0.168)		-0.5881*** (0.183)		-0.3618*** (0.133)	
$\Delta IR \times CAPITAL$	(0.100)	0.1091*** (0.030)	(0.100)	0.0997*** (0.033)	(0.100)	0.0683*** (0.023)
$\Delta IR \times LIQUIDITY$		-0.0045 (0.019)		-0.0521** (0.022)		-0.0400** (0.016)
Observations $R^2$	7,582 0.377	9,327 0.203	13,765 0.412	15,714 0.277	13,765 0.412	15,714 0.277
Bank FE	Ves	0.205 Yes	Ves		Ves	Yes
Firm FE	Yes	105	Yes	Yes	Yes	ies -
District-industry $\times$ year-q FE	105	Yes	105	Yes	100	Yes
	Panel B. N	EW LOANS (I	(n)			
$\Delta IR$	-0.0141** (0.006)		-0.0164 (0.011)		-0.0198*** (0.007)	
$\Delta IR \times CAPITAL$	(0.000)	0.0043 (0.003)	(0.011)	0.0080*** (0.003)	(0.007)	0.0052*** (0.002)
$\Delta IR  imes LIQUIDITY$		-0.0037*** (0.001)		-0.0047*** (0.001)		-0.0026*** (0.001)
Observations	2,216	1,649	3,563	2,652	3,563	2,652
$R^2$	0.445	0.542	0.431	0.530	0.431	0.530
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry FE District-industry $\times$ year-q FE	Yes	Yes	Yes	- Yes	Yes	- Yes
	<b>Panel C.</b> Δ <i>l</i>	LOAN RATE				
ΔIR	0.4968***		0.5345***		0.4206***	
$\Delta IR \times CAPITAL$	(0.044)	-0.0368***	(0.073)	-0.0416***	(0.057)	-0.0289***
BIK × CALITAL		(0.008)		(0.009)		(0.007)
$\Delta IR \times LIQUIDITY$		0.0232***		0.0462***		0.0267***
$\sim$		(0.004)		(0.005)		(0.004)
Observations	1,062	754	1,516	1,066	1,516	1,066
$R^2$	0.090	0.191	0.092	0.197	0.096	0.194
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry FE District-industry $\times$ year-q FE	Yes	- Yes	Yes	- Yes	Yes	- Yes
District-industry × year-q FE		165		105		165
Macro controls	Yes	-	Yes	-	Yes	-
Bank controls	Yes	Yes	Yes	Yes	Yes	Yes
Interactions with $\triangle GDP$ and $\triangle CPI$		Yes		Yes		Yes

### Table A8: Robustness—Alternative interest rates

*Notes*: This table examines the robustness of our main results to alternative interest rates. Instead of the 7-day interbank rate we use the policy rate available as of 2011:Q2 (columns 1-2), the 91-day Treasury bill rate (columns 3-4), and the re-discount rate at which banks with a liquidity shortage can access funds from central bank against eligible securities (columns 5-6). The dependent variables are *LOAN GRANTED* in Panel A, *NEW LOANS* (*ln*) in Panel B, and  $\Delta LOAN$  *RATE* in Panel C. All controls and lag structure as in the baseline regressions. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	LOAN GRANTED (1) (2)	ANTED (2)	(3)	(4)	(5)	(5) (6)	(2)	(8)	(9) (10) (10)	ATE (10)	(11)	(12)
ΔRIR ΔRIR × CAPITAL ΔRIR × LIQUIDITY	-0.2289*** (0.053)	-0.2259*** (0.058)	-0.1462*** (0.054)	0.0184** (0.009) -0.0262*** (0.009)	-0.0174*** (0.005)	-0.0310*** (0.006)	-0.0218*** (0.008)	0.0033** (0.001) -0.0016** (0.001)	0.3515*** (0.046)	0.4616*** (0.058)	0.4490*** (0.059)	-0.0340*** (0.007) 0.0248*** (0.005)
Observations R-squared	13,870 0.403	$13,870 \\ 0.403$	13,765 0.411	15,714 0.273	3,563 0.418	3,563 0.422	3,563 0.431	2,652 0.532	$1,516 \\ 0.082$	$1,516 \\ 0.096$	$1,516 \\ 0.101$	1,066 0.194
Macro controls Bank controls Interactions with $\Delta GDP$ and $\Delta CPI$		Yes	Yes Yes	Yes Yes		Yes	Yes Yes	Yes Yes		Yes	Yes Yes	Yes Yes
Bank FE Firm FF	Yes	Yes Yes	Yes Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
District-industry District-industry × year-quarter FE	3	2	21	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Table A9: Robustness-Real interest rate

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	Taylor resid		Taylor resid	
	(1)	(2)	(3)	(4)
	Panel A. LC	OAN GRANTED		
$\Delta IR_{Taylor}$	-0.1676** (0.073)		-0.1225* (0.072)	
$\Delta IR_{Taylor} \times CAPITAL$	(0.07.0)	0.0158# (0.010)	(0.0.2)	0.0515*** (0.019)
$\Delta IR_{Taylor} \times LIQUIDITY$		-0.0334*** (0.005)		(0.019) -0.0442** (0.019)
Observations	13,765	15,714	13,765	15,714
R <sup>2</sup>	0.409	0.276	0.409	0.276
Bank FE	Yes	Yes	Yes	Yes
Firm FE	Yes		Yes	
District-industry $\times$ year-quarter FE		Yes		Yes
	Panel B. NE	EW LOANS (ln)		
$\Delta IR_{Taylor}$	-0.0104***		0.0085	
	(0.003)	0.0005	(0.007)	
$\Delta IR_{Taylor}  imes CAPITAL$		0.0022*		0.0038***
		(0.001)		(0.001)
$\Delta IR_{Taylor} \times LIQUIDITY$		-0.0005		-0.0020**
		(0.001)		(0.001)
Observations	3,563	2,652	3,563	2,652
R <sup>2</sup>	0.428	0.533	0.427	0.534
Bank FE	Yes	Yes	Yes	Yes
District-industry FE	Yes	-	Yes	-
District-industry $\times$ year-quarter FE		Yes		Yes
	<b>Panel C.</b> $\Delta L$	OAN RATE		
$\Delta IR_{Taylor}$	0.1578**		0.1175**	
	(0.064)		(0.044)	_
$\Delta IR_{Taylor} \times CAPITAL$		-0.0158***		-0.0172**
		(0.004)		(0.008)
$\Delta IR_{Taylor}  imes LIQUIDITY$		0.0073**		0.0043
		(0.003)		(0.005)
Observations	1,516	1,066	1,516	1,066
$R^2$	0.026	0.188	0.019	0.187
Bank FE	Yes	Yes	Yes	Yes
District-industry FE	Yes	-	Yes	-
District-industry $\times$ year-quarter FE		Yes		Yes
Bank controls	Vec	Voc	Voc	Voc
Bank controls Interactions with $\Delta GDP$ and $\Delta CPI$	Yes	Yes Yes	Yes	Yes Yes

Table A10: Robustness—Alternative interest rate based on Taylor (1993) rule

*Notes*: This table examines the robustness of our main results to using a standard measure of monetary policy surprises defined as the difference between the 7-day interbank rate the interest rate implied by Taylor (1993)-like rule. The implied interest rate is predicted in a regression of *IR* on: 1-quarter lagged GDP growth and inflation (columns 1-2), and 1- and 2-quarter lagged GDP growth and inflation (columns 3-4). The dependent variables are *LOAN GRANTED* in Panel A, *NEW LOANS (ln)* in Panel B, and  $\Delta LOAN RATE$  in Panel C. All controls and lag structure as in the baseline regressions. Standard errors, clustered at the district level, are reported in parentheses. # significant at 15%, \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	NEW LOA	NS(ln)		$\Delta LOAN R$	ATE	
	(1)	(2)	(3)	(4)	(5)	(6)
$\Delta IR$	-0.0219*** (0.003)			0.2965*** (0.006)		
$\Delta IR  imes CAPITAL$		0.0019*	0.0036***		-0.0133***	-0.0018
$\Delta IR \times LIQUIDITY$		(0.001) -0.0000 (0.001)	(0.001) -0.0022*** (0.000)		(0.002) 0.0032** (0.002)	(0.003) 0.0106*** (0.001)
Observations	18,199	17,555	15,541	12,582	11,904	9,467
$R^2$	0.141	0.224	0.697	0.176	0.259	0.688
Macro controls	Yes		-	Yes		-
Bank controls	Yes	Yes	Yes	Yes	Yes	Yes
Interactions with $\triangle GDP$ and $\triangle CPI$		Yes	Yes		Yes	Yes
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry FE	Yes			Yes		
District-industry $\times$ year-q FE			Yes			Yes
Firm $\times$ year FE		Yes			Yes	

### Table A11: Robustness—Intensive margin regressions at the loan level

*Notes*: This table examines the robustness of our intensive margin baseline results to running the regressions at the loan level as opposed to the bank-firm cluster-quarter level (as in Tables 4-6). The dependent variables are *NEW LOANS* (*ln*) in columns 1-3 and  $\Delta LOAN RATE$  in columns 4-6. All controls and lag structure as in the baseline regressions. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

Cluster on:	Industry	×district (ID)	ID & ban	k	ID, bank,	& year-q
	(1)	(2)	(3)	(4)	(5)	(6)
	Panel A.	LOAN GRANT	ED			
ΔIR	-0.4767*** (0.166)	:	-0.4767** (0.205)		-0.4767*** (0.162)	
$\Delta IR \times CAPITAL$	(0.100)	0.0720*** (0.024)	(0.203)	0.0720*** (0.028)	(0.102)	0.0720*** (0.025)
$\Delta IR  imes LIQUIDITY$		-0.0420** (0.021)		-0.0420** (0.017)		-0.0420** (0.016)
Observations	10,488	11,489	10,488	11,489	10,488	11,489
$R^2$	0.390	0.270	0.390	0.270	0.390	0.270
Bank FE	Yes		Yes		Yes	
Firm FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry $\times$ year-q FE		Yes		Yes		Yes
	Panel B.	NEW LOANS (	ln)			
$\Delta IR$	-0.0223***	,	-0.0223***		-0.0223**	
	(0.008)		(0.008)		(0.009)	
$\Delta IR  imes CAPITAL$		0.0039*		0.0039*		0.0039
		(0.002)		(0.002)		(0.002)
$\Delta IR  imes LIQUIDITY$		-0.0022		-0.0022		-0.0022
		(0.001)		(0.001)		(0.002)
Observations	3,563	2,652	3,563	2,652	3,563	2,652
$R^2$	0.431	0.533	0.431	0.533	0.431	0.533
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry $\times$ year-q FE		Yes		Yes		Yes
	Panel C.	ΔLOAN RATE				
$\Delta IR$	0.4722***		0.4722***		0.4722***	
	(0.063)		(0.061)		(0.074)	
$\Delta IR \times CAPITAL$		-0.0343***		-0.0343***		-0.0343***
		(0.011)		(0.011)		(0.012)
$\Delta IR \times LIQUIDITY$		0.0239		0.0239		0.0239
		(0.015)		(0.018)		(0.019)
Observations	1,516	1,066	1,516	1,066	1,516	1,066
$R^2$	0.049	0.194	0.049	0.194	0.049	0.194
Bank FE	Yes	Yes	Yes	Yes	Yes	Yes
District-industry $\times$ year-q FE		Yes		Yes		Yes
Macro controls	Yes		Yes		Yes	
Bank controls	Yes	Yes	Yes	Yes	Yes	Yes
Interactions with $\triangle GDP$ and $\triangle CPI$	100	Yes	100	Yes	105	Yes

### Table A12: Robustness—Alternative approaches to clustering the standard errors

*Notes*: This table examines the robustness of our main results to alternatie estimators for the standard errors. In columns 1-2 we cluster on industry×district; in columns 3-4 we double-cluster on industry×district and bank; and in columns 5-6 we cluster on industry×district, bank, and year-quarter. The dependent variables are *LOAN GRANTED* in Panel A, *NEW LOANS* (*ln*) in Panel B, and  $\Delta LOAN$  *RATE* in Panel C. All controls and lag structure as in the baseline regressions. Standard errors, clustered at the district level, are reported in parentheses. # significant at 20%, \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

	(1)	(2)	(3)	(4)
	Panel A. LO.	AN GRANTED		
$\Delta IR$	-0.0170*** (0.002)	-0.0107** (0.004)	-0.0098*** (0.003)	
$\Delta IR \times CAPITAL$	(0.002)	(0.001)	(0.000)	0.0036*** (0.001)
$\Delta IR \times LIQUIDITY$				-0.0011*** (0.000)
Observations	1,932	1,932	1,931	2,160
$R^2$	0.421	0.429	0.444	0.340
Firm FE	Yes	Yes	Yes	No
Bank FE District-industry × year-quarter FE	Yes	Yes	Yes	Yes Yes
	Panel B. NE	W LOANS (ln)		
ΔIR	-0.0098 (0.007)	-0.0062 (0.005)	-0.0066 (0.005)	
$\Delta IR  imes CAPITAL$	· · ·	· · ·	· · ·	-0.0004 (0.004)
$\Delta IR \times LIQUIDITY$				-0.0019 (0.002)
Observations	1,008	1,008	1,007	846
R <sup>2</sup>	0.216	0.219	0.220	0.287
Bank FE	Yes	Yes	Yes	Yes
District-industry FE District-industry $\times$ year-quarter FE	Yes	Yes	Yes	Yes Yes
	Panel C. $\Delta L$	DAN RATE		
$\Delta IR$	-0.0378** (0.013)	-0.0519** (0.017)	-0.0221 (0.014)	
$\Delta IR \times CAPITAL$	(0.013)	(0.017)	(0.014)	0.0349
				(0.027)
$\Delta IR \times LIQUIDITY$				-0.0567
				(0.040)
Observations	462	462	461	396
R <sup>2</sup>	0.018	0.023	0.028	0.263
Bank FE	Yes	Yes	Yes	Yes
District-industry FE	Yes	Yes	Yes	Yes
District-industry $\times$ year-quarter FE				Yes
Macro controls		Yes	Yes	-
Bank controls			Yes	Yes
Interactions with $\triangle GDP$ and $\triangle CPI$				Yes

Table A13: Lending in foreign currencies

*Notes*: This table looks at the bank lending channel of monetary policy for loans in foreign currencies (the sample contains only foreign currency loan applications and granted loans). The dependent variable is *LOAN GRANTED* in Panel A, the granted loan amount *NEW LOANS* (*ln*) in Panel B, and the change in the average loan rate  $\Delta LOAN$  *RATE* in Panel C. All controls and lag structure as in the baseline specifications. Standard errors, clustered at the district level, are reported in parentheses. \* significant at 10%; \*\* significant at 5%; \*\*\* significant at 1%.

### A-II Description of credit register data

The credit register in Uganda is maintained by the private credit bureau Compuscan Uganda CRB Ltd. under the supervision of the Bank of Uganda. The credit register was set up in 2008 and collects confidential data on corporate loan applications and granted loans based on monthly reports from all supervised financial institutions. Participating institutions include commercial banks, microfinance deposit-taking institutions, and other credit institutions. The CRB was fully operationalized in 2009 (Bank of Uganda, 2009).

The credit register collects information on both the universe of loan applications (with accept/reject decisions) and loan originations to non-individual borrowers (such as firms, stateowned companies, non-governmental associations, other associations, etc.). These two different types of data data are submitted separately by participating institutions to the CRB and are maintained in two distinct datasets (originally called "credit applications" and "credit accounts").

Borrowers are identified by one or several identifiers out of five possible identifiers: the registration certificate, the tax ID, value-added tax ID, the Financial Card System (FCS) number, and the Kacitali number. In order to streamline borrower identifiers, in November 2009 the Bank of Uganda made it mandatory that all borrowers in the credit register are issued a financial card and associated FCS number, for tracking purposes. The CRB started issuing financial cards and FCS numbers in 2010; this process was completed over the following three years. During this time, borrowers continued to be identified in the credit register by one or more of the five identifiers mentioned above. From these identifiers we construct a unique numerical code for each borrower (by concatenating the available identifiers), which allows us to track borrower activity over time and across banks *within* the loan-applications and loan-originations datasets, respectively.

Given that lenders were not required to report to the CRB the same identifiers, for a given borrower, in both the loan application and loan origination datasets, it is infeasible to trace borrowers across these datasets and to find successful applications in the granted-loans file. Furthermore, to our knowledge and based on discussions with CRB staff, there were no attempts to ensure consistency between these datasets.

As with the set-up of any credit register, there was a learning period both for reporting institutions and the CRB in relation to data submissions, which affected their quality. Coverage of the credit register and consistency of borrower identifiers continually improved since 2009 and stabilized around mid-2010. (See Figures A5 and A6 on the representativeness of the credit register.) As a result, we chose to start our analysis in 2010:Q3. The sample refers to the lending activities of 15 commercial banks which account for 95% of total banking sector assets. Before cleaning the datasets, we have the following sample sizes: 39,643 applications and 29,960 new loans. After cleaning the datasets, we have the following sample sizes: 16,784 loan applications (with accept/reject decision) and 25,948 new granted loans. (Notice that in the cleaning process we lose more loan applications than granted loans. This is because we lose applications with "pending" status which cannot be assigned an accept or reject decision; as well as applications for which borrower location is missing). In the clean datasets there are 8,679 applicant firms (loan-applications dataset) and 8,718 borrowing firms (loan-originations dataset). In Section 3.1 of the main text we give further details on the regression samples.

Given the separate nature of reporting institutions' data submissions on loan applications and new granted loans, respectively, a potential concern is sample selection (of firms into the loanoriginations dataset, both unconditional as well as conditional on an application being successful). To alleviate this concern, we conduct a comparison of key attributes (distribution of observations by district and region, industry, bank, and year) across the corresponding two samples. The results of the comparison, using data for the full sample period 2010:Q3- 2014:Q2, and separately for the tightening and easing periods, are shown in the tables below. Table A14: Comparison of loan-applications and loan-originations regression samples: Full sample

	Applications		New loans		
	All	Accepted		Ratio	Ratio
	% obs.	% obs.	% obs.		
	[1]	[2]	[3]	[3]/[1]	[3]/[2]
By district					
Kampala	53.5	53.1	76.4	1.4	1.4
Top 3 districts	67.8	67.2	82.1	1.2	1.2
Top 5 districts	74.1	73.3	86.0	1.2	1.2
Top 10 districts	84.1	83.4	92.2	1.1	1.1
By industry					
Agriculture	13.2	12.0	17.6	1.3	1.5
Mining and Quarrying	1.8	2.0	1.5	0.8	0.7
Manufacturing	6.9	8.1	14.4	2.1	1.8
Trade	23.8	23.6	25.5	1.1	1.1
Transport and Communication	16.3	16.1	10.5	0.6	0.7
Electricity and Water	0.4	0.5	0.7	1.6	1.5
Building, Construction and Real Estate	13.8	15.1	18.3	1.3	1.2
Community, Social and Other Services	18.5	17.8	9.9	0.5	0.6
Other	5.3	5.0	1.7	0.3	0.3
By bank					
Top 3 banks	52.9	60.2	49.2	0.9	0.8
Top 5 banks	68.9	72.7	68.0	1.0	0.9
By year or period					
Tightening (2010:Q3-2011:Q4)	49.5	52.1	36.3	0.7	0.7
Easing (2012:Q1-2014:Q2)	59.9	57.2	72.3	1.2	1.3
2010	13.5	14.3	10.4	0.8	0.7
2011	26.6	28.4	17.4	0.7	0.6
2012	21.3	20.6	19.1	0.9	0.9
2013	23.9	23.1	32.0	1.3	1.4
2014	14.7	13.6	21.2	1.4	1.6

*Notes*: The table reports the share of observations in the loan-applications (all applications, column 1; and accepted applications, column 2) and loan-originations regression datasets (column 3) and the ratio between new granted loans on the one hand and applications on the other hand (columns 4-5). *Data sources*: Compuscan Uganda CRB Ltd.

	All applications	Accepted applications	New loans	Ratio	Ratio	All applications	Accepted applications	New loans	Ratio	Ratio
	% obs.	% obs.	% obs.			% obs.	% obs.	% obs.		
	[1]	[2]	[3]	[3]/[1]	[3]/[2]	[4]	[5]	[9]	[6]/[4]	[6]/[5]
	A. Ti	A. Tightening period (2010:Q3-2011:Q4)	l (2010:Q3	-2011:Q4)		B. 1	B. Easing period (2012:Q1-2014:Q2)	2012:Q1-2	.014:Q2)	
By district							4 )			
Top 3 districts	69.4	68.9	80.7	1.2	1.2	67.1	65.8	82.6	1.2	1.3
Top 5 districts	75.4	75.7	85.3	1.1	1.1	73.4	71.8	86.5	1.2	1.2
Top 10 districts	85.3	85.7	92.1	1.1	1.1	83.5	81.9	92.3	1.1	1.1
By industry										
Agriculture	14.2	12.2	13.2	0.9	1.1	12.6	11.9	19.3	1.5	1.6
Mining and Quarrying	1.8	2.0	1.1	0.6	0.5	1.9	2.0	1.6	0.9	0.8
Manufacturing	8.5	9.6	15.3	1.8	1.6	5.9	6.9	14.1	2.4	2.0
Trade	25.1	24.9	28.5	1.1	1.1	22.9	22.6	24.3	1.1	1.1
Transport and Communication	13.5	13.1	11.3	0.8	0.0	18.1	18.3	10.2	0.6	0.6
Electricity and Water	0.3	0.2	0.7	2.4	3.2	0.6	0.7	0.7	1.3	1.1
Building, Construction and Real Estate	14.4	16.1	16.2	1.1	1.0	13.3	14.4	19.1	1.4	1.3
Community, Social and Other Services	17.4	17.2	11.3	0.7	0.7	19.2	18.3	9.4	0.5	0.5
Other	4.9	4.9	2.6	0.5	0.5	5.6	5.0	1.3	0.2	0.3
By bank										
Top 3 banks	53.7	56.5	33.3	0.6	0.6	56.8	63.0	55.3	1.0	0.9
Top 5 banks	72.3	71.8	55.6	0.8	0.8	70.6	73.4	72.7	1.0	1.0

Table A15: Comparison of loan-applications and loan-originations regression samples: Tightening vs. easing periods

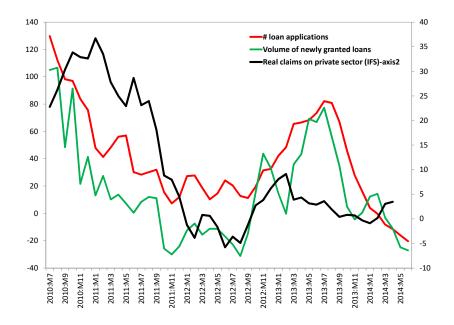
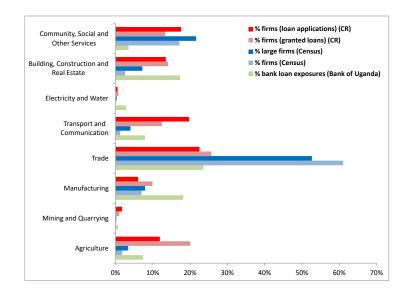


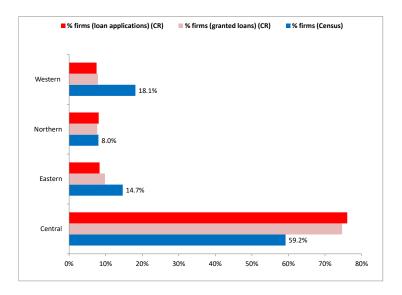
Figure A5: Credit growth in the credit register vs. aggregate statistics

*Notes*: The figure plots the real growth rate of the total volume of new granted loans (from the credit register), that of banking sector claims on the private sector (from the IMF's International Financial Statistics), and the growth rate of the total number of loan applications (from the credit register) on a monthly basis. All growth rates are year-on-year. *Data sources*: Bank of Uganda and IMF International Financial Statistics (IFS).

Figure A6: Firm distribution by industry and region in the credit register vs. aggregate statistics



#### (a) Industry distribution



#### (b) Geographical distribution

*Notes*: The figure plots the distributions of loan applicants and borrowing firms (from the credit register "CR") against those from the 2010-2011 Census and aggregate banking system statistics (Bank of Uganda), by industry (Panel A) and by region (Panel B). In Panel A we additionally report the distribution of *large* firms by industry, where firms are large if they have an annual turnover in excess of 10 million Ugandan shillings (approximately 2,800 USD); and the distribution of outstanding loan claims for all commercial banks. *Data sources*: Bank of Uganda and Uganda Bureau of Statistics.

# A-III List of export product categories

PAPER & PAPERBOARD; ART OF PAPER PULP, PAPER/PAPERBOARD

48

Code	Description of export product	Code	Description of export product
01	LIVE ANIMALS	49	PRINTED BOOKS, NEWSPAPERS, PICTURES & OTHER PRODUCT ETC
02	MEAT AND EDIBLE MEAT OFFAL	50	SILK
03	FISH & CRUSTACEAN, MOLLUSC & OTHER AQUATIC INVERTEBRATE	51	WOOL, FINE/COARSE ANIMAL HAIR, HORSEHAIR YARN & FABRIC
04	DAIRY PROD; BIRDS' EGGS; NATURAL HONEY; EDIBLE PROD NES	52	COTTON
05	PRODUCTS OF ANIMAL ORIGIN, NES OR INCLUDED.	53	OTHER VEGETABLE TEXTILE FIBRES; PAPER YARN & WOVEN FAB
06	LIVE TREE & OTHER PLANT; BULB, ROOT; CUT FLOWERS ETC	54	MAN-MADE FILAMENTS
07	EDIBLE VEGETABLES AND CERTAIN ROOTS AND TUBERS	55	MAN-MADE STAPLE FIBRES
08	EDIBLE FRUIT AND NUTS; PEEL OF CITRUS FRUIT OR MELONS	56	WADDING, FELT & NONWOVEN; YARNS; TWINE, CORDAGE, ETC
09	COFFEE, TEA, MATE AND SPICES	57	CARPETS AND OTHER TEXTILE FLOOR COVERINGS
10	CEREALS	58	SPECIAL WOVEN FAB; TUFTED TEX FAB; LACE; TAPESTRIES ETC
11	PROD MILL INDUST; MALT; STARCHES; INULIN; WHEAT GLUTEN	59	IMPREGNATED, COATED, COVER/LAMINATED TEXTILE FABRIC ETC
12	OIL SEED, OLEAGI FRUITS; MISCELL GRAIN, SEED, FRUIT ETC	60	KNITTED OR CROCHETED FABRICS
13	LAC; GUMS, RESINS & OTHER VEGETABLE SAPS & EXTRACTS	61	ART OF APPAREL & CLOTHING ACCESS, KNITTED OR CROCHETED
14	VEGETABLE PLAITING MATERIALS; VEGETABLE PRODUCTS NES	62	ART OF APPAREL & CLOTHING ACCESS, NOT KNITTED/CROCHETED
15	ANIMAL/VEG FATS & OILS & THEIR CLEAVAGE PRODUCTS; ETC	63	OTHER MADE UP TEXTILE ARTICLES; SETS; WORN CLOTHING ETC
16	PREP OF MEAT, FISH OR CRUSTACEANS, MOLLUSCS ETC	64	FOOTWEAR, GAITERS AND THE LIKE; PARTS OF SUCH ARTICLES
17	SUGARS AND SUGAR CONFECTIONERY	65	HEADGEAR AND PARTS THEREOF
18	COCOA AND COCOA PREPARATIONS	66	UMBRELLAS, WALKING-STICKS, SEAT-STICKS, WHIPS, ETC
19	PREP OF CEREAL, FLOUR, STARCH/MILK; PASTRYCOOKS' PROD	67	PREPR FEATHERS & DOWN; ARTI FLOWER; ARTICLES HUMAN HAIR
20	PREP OF VEGETABLE, FRUIT, NUTS OR OTHER PARTS OF PLANTS	68	ART OF STONE, PLASTER, CEMENT, ASBESTOS, MICA/SIM MAT
21	MISCELLANEOUS EDIBLE PREPARATIONS	69	CERAMIC PRODUCTS
22	BEVERAGES, SPIRITS AND VINEGAR	70	GLASS AND GLASSWARE
23	RESIDUES & WASTE FROM THE FOOD INDUST; PREPR ANI FODDER	71	NATURAL/CULTURED PEARLS, PREC STONES & METALS, COIN ETC
24	TOBACCO AND MANUFACTURED TOBACCO SUBSTITUTES	72	IRON AND STEEL
25	SALT; SULPHUR; EARTH & STON; PLASTERING MAT; LIME & CEM	73	ARTICLES OF IRON OR STEEL
26	ORES, SLAG AND ASH	74	COPPER AND ARTICLES THEREOF
27	MINERAL FUELS, OILS & PRODUCT OF THEIR DISTILLATION; ETC	75	NICKEL AND ARTICLES THEREOF
28	INORGN CHEM; COMPDS OF PREC MET, RADIOACT ELEMENTS ETC	76	ALUMINIUM AND ARTICLES THEREOF
29	ORGANIC CHEMICALS	78	LEAD AND ARTICLES THEREOF
30	PHARMACEUTICAL PRODUCTS	79	ZINC AND ARTICLES THEREOF
31	FERTILISERS	80	TIN AND ARTICLES THEREOF
32	TANNING/DYEING EXTRACT; TANNINS & DERIVS; PIGM ETC	81	OTHER BASE METALS; CERMETS; ARTICLES THEREOF
33	ESSENTIAL OILS & RESINOIDS; PERF, COSMETIC/TOILET PREP	82	TOOL, IMPLEMENT, CUTLERY, SPOON & FORK, OF BASE MET ETC
34	SOAP, ORGANIC SURFACE-ACTIVE AGENTS, WASHING PREP, ETC	83	MISCELLANEOUS ARTICLES OF BASEE METAL
35	ALBUMINOIDAL SUBS; MODIFIED STARCHES; GLUES; ENZYMES	84	NUCLEAR REACTORS, BOILIERS, MCHY & MECH APPLIANCE; PARTS
36	EXPLOSIVES; PYROTECHNIC PROD; MATCHES; PYROP ALLOY; ETC	85	ELECTRICAL MCHY EQUIP PARTS THEREOF; SOUND RECORDER ETC
37	PHOTOGRAPHIC OR CINEMATOGRAPHIC GOODS	86	RAILW/TRAMW LOCOM, ROLLING-STOCK & PARTS THEREOF; ETC
38	MISCELLANEOUS CHEMICAL PRODUCTS	87	VEHICLES O/T RAILW/TRAMW ROLL-STOCK, PTS & ACCESSORIES
39	PLASTICS AND ARTICLES THEREOF	88	AIRCRAFT, SPACECRAFT, AND PARTS THEREOF
40	RUBBER AND ARTICLES THEREOF	89	SHIPS, BOATS AND FLOATING STRUCTURES
41	RAW HIDES AND SKINS (OTHER THAN FURSKINS) AND LEATHER	90	OPTICAL, PHOTO, CINE, MEAS, CHECKING, PRECISION, ETC
42	ARTICLES OF LEATHER; SADDLERY/HARNESS; TRAVEL GOODS ETC	91	CLOCKS AND WATCHES AND PARTS THEREOF
43	FURSKINS AND ARTIFICIAL FUR; MANUFACTURES THEREOF	92	MUSICAL INSTRUMENTS; PARTS AND ACCESS OF SUCH ARTICLES
44	WOOD AND ARTICLES OF WOOD; WOOD CHARCOAL	93	ARMS AND AMMUNITION; PARTS AND ACCESSORIES THEREOF
45	CORK AND ARTICLES OF CORK	94	FURNITURE; BEDDING, MATTRESS, MATT SUPPORT, CUSHION ETC
46	MANUFACTURES OF STRAW, ESPARTO/OTHER PLAITING MAT; ETC	95 06	TOYS, GAMES & SPORTS REQUISITES; PARTS & ACCESS THEREOF
47	PULP OF WOOD/OF OTHER FIBROUS CELLULOSIC MAT; WASTE ETC	96	MISCELLANEOUS MANUFACTURED ARTICLES

*Notes*: The table lists the 97 export product categories and their numeric codes in the raw data used for real-effects exports regressions in Table 7. *Data sources*: Uganda Bureau of Statistics.

97 WORKS OF ART, COLLECTORS' PIECES AND ANTIQUES

# A-IV Media coverage of economic issues

Date	Title	Link	Description
January 2011 2010 registers lower inflation as consumer prices edge up		http://www.monitor.co.ug/Business/Commod ities/688610-1082690-ogh11qz/index.html	Praises progress against inflation since 2009
February 2011	Oil prices increase January inflation	http://www.monitor.co.ug/Business/688322- 1099826-dga67k/index.html	Describes supply-side inflationary pressures (commodity and food prices); currency depreciation.
April 2011	Inflation driving markets to new highs	http://www.monitor.co.ug/Business/688322- 1136974-dvlliq/index.html	Discusses skyrocketing inflaton. Cites government officials stating that the government cannot do anything to stop inflation as prices are the result of market forces. No communications from the Bank of Uganda for this article.
April 2011	High inflation beyond our government's control	http://www.monitor.co.ug/News/National/68 8334-1141602-anwh34z/index.html	Discusses government's statements that inflation is beyond its control as it is the result of commodity and food prices; and external factors.
May 2011	Inflation rises to 14 percent	http://www.monitor.co.ug/News/National/68 8334-1154634-an8u5kz/index.html	Discusses skyrocketing inflation. Cites government officials suggesting fiscal instruments to fight inflation. No communications from the Bank of Uganda for this article.
June 2011	Energy most pressing issue	http://www.monitor.co.ug/News/National/68 8334-1176912-alybf2z/index.html	Reports on State of the Nation Address by the President. Refers to supply-side inflation-fighting policies including alleviating bottlenecks in infrastructure.
June 2011	Short and long-term policy responses to the current economic crisis in Uganda	http://www.monitor.co.ug/Business/688322- 1173270-dy0in6/index.html	Cites government officials that external commodity prices and food shortages are driving inflation. States that the government "has neither proposed nor implemented any concrete short-term interventions to reverse the escalation in prices." Argues that the government should conduct policy interventions to stability the economy, support growth, and reduce hardships on the vulnerable.
June 2011	2011-2012 Uganda budget speech in full	http://www.monitor.co.ug/News/National/68 8334-1228632-a5wxt5z/index.html	Reports on the Budget Speech for the Financial year 2011/2012. It is stated that inflation pressures are the result of a shock to food prices and are expected to subside in the subsequent financial year as food supplies to domestic markets
September 2011	Uganda inflation hits 21.4%	http://www.monitor.co.ug/News/National/68 8334-1290612-a1rq63z/index.html_	improve. (after the first policy rate hike). No indication of the Bank of Uganda planning to tighten further. Argues the effects of the first tightening will take some time to impact the real economy.
December 2011	Government domestic costs go up	http://www.monitor.co.ug/News/National/68 8334-1177096-alxsxsz/index.html	(after the second policy rate hike) Discusses inflation and fiscal developments, as well as economic slowdown. No reference to plans for further monetary policy actions.

*Notes*: The table lists selected newspaper articles in the leading media outlet Daily Monitor covering economic issues during 2011. *Data sources*: Authors' searches.