Mixing QE and Interest Rate Policies at the Effective Lower Bound: Micro Evidence from the Euro Area*

Christian Bittner¹

Alexander Rodnyansky²

Farzad Saidi³

Yannick Timmer⁴

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Abstract

In the presence of negative monetary-policy rates and a zero lower bound on deposit rates, banks that are more exposed to central banks' asset-purchase programs reduce their lending to the real economy by more than their counterparts. When banks face a lower bound on customer deposit rates, an asset swap between securities and reserves reduces banks' net worth as the cost of holding reserves cannot be matched with a reduction in their cost of funding. Exploiting euro-area syndicated lending data and the German credit registry, we provide evidence that deposit-reliant banks with relatively higher funding costs and greater exposure to large-scale asset purchases reduce corporate lending relatively more, have lower stock returns, and rebalance their interbank lending from safe to risky countries.

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¹Goethe University Frankfurt & Deutsche Bundesbank

²University of Cambridge & CEPR

³University of Bonn & CEPR

⁴Federal Reserve Board

1 Introduction

Since the Great Financial Crisis the policy space for conventional, rate-based monetary stimulus has become increasingly limited. Central banks around the world have since employed unconventional monetary policies to fulfill their mandates.¹ Most prominently, they have implemented large-scale asset purchases, or quantitative easing (QE), to inject liquidity into the economy. As asset-purchase programs tend to take place in low-rate environments, when the limit of conventional monetary stimulus has been reached, or are used to smooth short-term rates, quantitative easing and rate-setting monetary policy at the effective lower bound seem inextricably linked. This renders it unclear how lower rates and quantitative easing interact, and whether they substitute or complement each other (Sims and Wu, 2020, 2021).

In this paper, we approach this question through the lens of a bank-based transmission channel of monetary policy. We do so by focusing on the euro area where monetary-policy rates broke through what was believed to be the zero lower bound (ZLB) in 2014—a clear expression of nearing the limits of conventional monetary stimulus—before the implementation of quantitative easing. We provide empirical evidence that banks that see only a weak pass-through of monetary policy to their funding costs and that are at the same time strongly exposed to QE reduce their credit supply to firms relatively more.

How do negative monetary-policy rates and QE interact? The latter leads to swapping securities with central-bank reserves on commercial banks' balance sheets. Cutting interest rates on these same reserves below zero effectively taxes newly created deposits at the central bank. In a frictionless world, banks would pass through these negative rates on their assets to the liability side. However, banks seem reluctant, or unable, to pass on negative rates to their depositors (Heider, Saidi, and Schepens, 2019; Eggertsson, Juelsrud, Summers, and Wold, 2019). This gives rise to cross-sectional heterogeneity in the pass-through of lower, negative monetary-policy rates. High-deposit banks incur higher funding costs in comparison to banks whose cost of funding is more aligned with the monetary-policy rate. When quantitative easing is implemented under negative rates, pass-through of lower monetary-policy rates to banks' asset side remains strong, or becomes even stronger, as long-term assets are replaced with central-bank reserves.² As a consequence, high-deposit banks do not only yield negative rates on central-bank reserves on their

¹See Bernanke (2020) for a synthesis of the new tools of monetary policy and their effectiveness since 2008.

²According to Brunnermeier and Koby (2018), this implies that QE should optimally be employed only after the room for lowering rates is exhausted, and gives rise to what they dub the "reversal interest rate" below which further rate cuts depress bank lending.

asset side, but also incur relatively higher funding costs, which in turn inhibits their ability to lend out to the non-financial sector. Empirically, we find evidence of such reversal for high-deposit banks. This is consistent with the rationale laid out by Repullo (2020), in that banks' funding costs determine their response to counteract what would otherwise constitute an adverse shock to their profitability.

We disentangle the effect of banks' exposure to asset purchases from the transmission of monetary-policy rates by exploiting variation in the pass-through of negative monetary-policy rates to banks' funding costs across countries and banks. First, since the European sovereign debt crisis, banks' funding costs vary significantly across euro-area countries, especially so for local deposit markets.³ When the respective rates are closer to the ZLB in a given country, pass-through of monetary-policy rates to banks' funding costs is more likely to be impaired. Second, when banks' funding costs are already close to the ZLB, the pass-through of even lower, negative monetary-policy rates is impaired primarily for retail deposits rather than other types of funding, such as wholesale market funding. Indeed, banks seem reluctant, or unable, to pass on negative rates to their depositors (Heider, Saidi, and Schepens, 2019; Eggertsson, Juelsrud, Summers, and Wold, 2019). This allows us to define banks' exposure to negative monetary-policy rates as a function of their funding structure, as the ZLB on retail deposit rates implies that deposit-funded banks incur higher funding costs than do otherwise-funded banks.

To test how banks' exposure to negative monetary-policy rates and QE affects their asset portfolios, we use granular data on syndicated lending by euro-area banks. These data allow us to compare the lending behavior of differentially treated banks to the same borrower. Moreover, the cross-country dimension enables us to compare banks with each other that are located in different countries where retail deposit rates may be far away or closer to the ZLB. While syndicated loans account for a sizable portion of total bank lending, they do not necessarily capture overall bank lending behavior in the euro area. Therefore, in addition to using syndicated-loan data, we conduct further analyses using microdata from Germany where a substantial portion of banks do not benefit from lower funding costs due to a binding ZLB on retail deposit rates.

To capture banks' exposure to negative monetary-policy rates, we use information on their funding structure, in particular their customer deposit share (Heider, Saidi, and Schepens, 2019). This reflects our rationale that high-deposit banks, unlike low-deposit banks, incur higher funding costs during the negative interest-rate period. To measure banks' exposure to QE during

³See, for instance, Bittner, Bonfim, Heider, Saidi, Schepens, and Soares (2020).

that period, we use the ex-ante relative prevalence of securities on their books (Rodnyansky and Darmouni, 2017). Finally, the resulting distinction between high- vs. low-deposit and high- vs. low-security banks is interacted with time variation in the ECB's asset purchases.

Irrespective of how we define the ECB's asset purchases to spill over to euro-area banks' balance sheets, we find that banks whose asset portfolios are more exposed to QE reduce their credit supply to the real economy relatively more when they rely more on deposit funding. We obtain our results controlling for time-invariant unobserved heterogeneity at the bank level, time-varying unobserved heterogeneity at the level of the countries in which these banks are incorporated, and also for time-varying unobserved heterogeneity at the firm level by including firm-time fixed effects. This within-firm estimator controls sufficiently well for overall credit demand, and can rule out negative firms' credit demand shocks as a driver of our results (Khwaja and Mian, 2008; Jiménez, Ongena, Peydró, and Saurina, 2014). In our preferred specification, a bank with a ten-percentage-point higher security and deposit ratio lends around 8.55% less in response to a one-standard-deviation increase in asset purchases.

We examine two relevant channels by which large-scale asset purchases exert an influence on banks' proclivity to lend in the presence of a negative interest-rate policy. The first channel implies a positive effect on banks' net worth, which sets in when asset purchases positively impact security prices. In turn, this price effect increases the marked-to-market value of banks' security holdings and, thus, raises banks' net worth—a mechanism also known as a "stealth recapitalization" (Brunnermeier and Sannikov, 2014). We find that this channel is limited if at all discernible in the euro area during QE, which is consistent with the observation that large-scale asset purchases had a small overall impact on sovereign bond prices.⁴ At the same time, in both the wider euro-area bank data and the German microdata, we do not find evidence in favor of a reserve-induced portfolio rebalancing channel (Christensen and Krogstrup, 2019). Banks that are more exposed to QE persistently keep more reserves on the asset side of their balance sheet, and do not rebalance their portfolio towards more illiquid loans.

However, in the presence of a negative interest-rate policy, these two channels are confounded by a third, negative force on the liability side. The effective swap between securities and central-bank reserves leads to a reduction in net worth if banks' funding costs do not drop accordingly. This is the case if banks are highly dependent on deposit funding, and if retail deposit rates are already close to the ZLB, as there is otherwise still room for them to drop. We show this to hold

⁴Evidence presented in section 3 on euro-area sovereign bond indices lends direct support to this interpretation.

true in low-rate environments such as the core of the euro area, while this is not the case in other countries of the euro area where sovereign yields (and deposit rates) are higher (Bittner, Bonfim, Heider, Saidi, Schepens, and Soares, 2020). As a result, instead of an increase in corporate lending, the asset purchases lead to higher excess reserves and lower corporate lending.

For the largest economy in the euro area, Germany, we can zoom in on this mechanism by means of administrative data from the Bundesbank. Using credit-registry data, we, first, corroborate our baseline result that banks with higher security and deposit ratios reduce their credit supply to firms relatively more when QE is implemented. This confirms that the negative credit-supply effects are not limited to syndicated loans, but extend to private credit attained by both small and large firms. Economically, we find comparable but larger effects for Germany than for the whole panel of euro-area banks, consistent with the idea that Germany is closer to the zero lower bound on deposit rates. Combining the German credit-registry data with more detailed balance-sheet data than is available for the panel of euro-area banks allows us to differentiate between household deposits, the rates on which face a hard ZLB, and corporate deposits, which see more pass-through of negative policy rates (Heider, Saidi, and Schepens, 2019; Altavilla, Burlon, Giannetti, and Holton, 2021). This enables us to compare banks with similar deposit ratios that differ only in the source of their deposits. In this manner, we find that banks with high security and high deposit ratios reduce their credit supply only if they are funded by household deposits, reaffirming the importance of the ZLB on retail deposit rates.

Second, we use data on German banks' security holdings to examine their trading of securities around the large-scale asset purchases. We find that banks with ex ante more securities sell more securities during the QE period, but their purchases are not significantly different from banks with less security holdings. Using the net sales of securities as an alternative measure of banks' exposure to QE, we corroborate our findings that banks that are more exposed to QE and have a higher deposit share reduce their credit supply by more. This evidence addresses the potential concern that the pre-existing share of securities of total assets does not proxy well banks' exposure to QE and, as such, may be driven by other bank-specific factors unrelated to the asset purchases.

Having shown that affected banks reduce their lending to the real sector, we consider the possibility that they rebalance their asset side by, instead, increasing their portion of liquid assets. To this end, we scrutinize German banks' interbank positions and find that consistent with precautionary liquidity hoarding, high-deposit banks that are more exposed to QE increase their

interbank lending, with possible implications for the distribution of interbank liquidity in the euro area. Using bilateral country-level banking flows, we present evidence that lends support to the idea that financial dependence of periphery banks from the core may have increased during the ECB's large-scale asset purchases.

Related literature. Our paper contributes to various strands of the literature. First, we contribute to the literature on the effects of negative interest rates in general and their bank-based transmission in particular. Brunnermeier and Koby (2018) show theoretically that when interest rates drop below a "reversal rate," a decline in interest rates can be contractionary. Ulate (2021) studies the effects of negative rates in a new DSGE model where banks intermediate the transmission of monetary policy. Heider, Saidi, and Schepens (2019) show that banks with higher deposit ratios reduce their syndicated lending by more in response to the introduction of negative monetary-policy rates in the euro area. Eggertsson, Juelsrud, Summers, and Wold (2019) show that retail household deposit rates in Sweden are subject to a lower bound and that once this bound is reached, the pass-through to lending rates and credit volumes is substantially lower, and bank equity values decline in response to further policy-rate cuts. Bottero, Minoiu, Peydró, Polo, Presbitero, and Sette (2021) show that that negative interest-rate policies can have expansionary effects on bank credit supply and firm-level outcomes through a portfolio rebalancing channel. Ampudia and Van den Heuvel (2018) show that during the period of negative interest rates in the euro area, stock prices of banks declined in response to accommodative monetarypolicy announcements, and even more so for banks with a high reliance on deposit funding.

In comparison to this literature on the transmission of negative monetary-policy rates,⁵ we explore its interaction with large-scale asset purchases, or QE. Krishnamurthy and Vissing-Jorgensen (2011) study the effect of QE on interest rates in the United States. Koijen, Koulischer, Nguyen, and Yogo (2021) show that banks sold purchase-eligible government bonds during QE. Using bank-level data, Paludkiewicz (2021) finds that German banks that see a stronger yield decline on their securities portfolio induced by QE are more likely to sell (eligible) bonds and increase their lending to the real sector. Rodnyansky and Darmouni (2017) define banks' exposure to QE by measuring the relative prevalence of mortgage-backed securities on their books, and show that in the U.S. banks that were strongly exposed to QE increased their lending. Di Maggio, Kermani, and Palmer (2019) find that after the first round of QE in the U.S., origination of mortgages qualifying for inclusion in eligible securities for Fed purchases increased a lot more

⁵See Heider, Saidi, and Schepens (2021) for a summary of this literature.

than did those of non-qualifying mortgages. On the other hand, Chakraborty, Goldstein, and MacKinlay (2020) document that more exposed banks increased mortgage lending at the expense of their commercial lending. Luck and Zimmermann (2020) study the employment effects of the transmission of QE to bank lending in the U.S. Other papers have adopted similar approaches to investigate the effects of unconventional monetary policies in Europe (Benetton and Fantino, 2021; Carpinelli and Crosignani, 2021; Peydró, Polo, and Sette, 2021; Crosignani, Faria-e Castro, and Fonseca, 2020; Grosse-Rueschkamp, Steffen, and Streitz, 2019; Acharya, Eisert, Eufinger, and Hirsch, 2019).

De Fiore, Hoerova, and Uhlig (2018) and Corradin, Eisenschmidt, Hoerova, Linzert, Schepens, and Sigaux (2020) show that asset purchases induce a scarcity effect, which induces money market frictions and can have negative effects on lending. Bianchi and Bigio (2014) argue theoretically that purchases of liquid assets (the ones we study) can be ineffective, whereas purchases of more illiquid assets (such as loans) can be more effective. Diamond, Jiang, and Ma (2021) show that the central-bank reserve creation through QE crowds out bank lending, consistent with our findings. In contrast to most papers in this literature, we specifically study whether the credit-supply response of banks to QE vary with the extent to which banks are exposed to the transmission of monetary-policy rates. Another distinction is that while most of the QE literature focuses on the announcement of QE, we study its implementation during its run-time.

The sole exception in the literature that studies the interaction between negative interest rates and QE is Brunnermeier and Koby (2018), who argue that QE should be employed only after interest-rate cuts are exhausted. When the central bank reduces interest rates, capital gains on banks' deposits increase and banks with large security holdings benefit disproportionately from these capital gains. Empirically, we find that during QE, banks that have a lot of security holdings do not benefit disproportionately more but actually less when they rely heavily on deposit funding.

2 Data

2.1 Bank Lending and Balance-Sheet Data

In the first part of the paper, we analyze credit supply in the syndicated-loan market in the euro area using data on syndicated-loan transactions from DealScan. For a syndicated loan, different

banks form a syndicate and then lend to firms. The lead arranger in a syndicate is usually responsible for monitoring the loan and various other responsibilities that are associated with risk management, see Ivashina and Scharfstein (2010). Lead arrangers tend to hold on to their loan shares, while other syndicate members (participants) can and do sell their shares in the secondary market. In the DealScan data, we only see the facility amount, the banks that participate in the syndicate, and whether they act as lead arrangers or other participants. However, banks' individual contributions are not properly recorded most of the time. We therefore follow the literature, and split two-thirds vs. one-third of the total loan amount equally among all lead arrangers and other participants, respectively.⁶

We then merge the syndicated-loan data with Bankscope data where we observe the balancesheet characteristics of the banks. In particular, we use data on banks' security holdings, their customer deposits, as well as various other control variables.

2.2 Bundesbank Microdata

We complement our analysis of syndicated lending in the euro area with administrative creditregistry data (BAKIS-M) from Germany (Schmieder, 2006). Banks domiciled in Germany are required to report all loans exceeding one million euros.⁷ The dataset contains the loan amount outstanding to the respective borrower on a quarterly basis.

In addition, we use the Securities Holdings Statistics, SHS-Base plus,⁸ formerly known as WpInvest (Blaschke, Sachs, and Yalcin, 2020). The dataset covers all securities held by German banks on their own behalf (full census). Banks report the holdings amount on a security-by-security basis.⁹ We enrich this dataset with security master data from the Centralised Securities Database (CSDB)¹⁰ (Bade, Flory, Gomolka, and Schnellbach, 2018). The purpose of the CSDB is to cover all securities likely to be held or transacted by euro-area residents. With its high quality and coverage of more than ten million securities per time stamp, we incur almost no loss of observations from merging.

⁶See, for example, Chodorow-Reich (2014). The results are robust to other choices.

⁷In January 2015 the reporting threshold was reduced from formerly 1.5m euros. Note that this reporting requirement applies for all borrowers, including those with less credit exposure, as long as the total loan amount of said borrowers parent and all affiliated units is equal to or exceeds the threshold at any point in time during the reporting period.

⁸Data ID: 10.12757/Bbk.SHSBaseplus.05122006

⁹See also Timmer (2018).

¹⁰Data ID: 10.12757/BBk.CSDB.200903-201912.01.01

Finally, we use the Monthly Balance Sheet Statistics (BISTA)¹¹ including banks' asset and liability positions (Gomolka, Schäfer, and Stahl, 2020). This allows us to construct banks' deposit ratios (deposits over total assets) and security ratios (securities over total assets).

3 Stylized Facts

We start with graphical evidence suggesting which balance-sheet characteristics determine the extent to which euro-area banks are affected by quantitative easing, bearing in mind that the ECB's preceding introduction of negative monetary-policy rates in 2014 may have affected the transmission channels of quantitative easing thereafter.

Figure 5 shows that when the ECB kicked off its asset-purchase programs in 2015, banks' security holdings declined substantially (based on Bankscope data). In 2013 and 2014 security holdings of banks remained relatively stable, but once the ECB started purchasing assets at a large scale, security holdings of banks declined significantly, while at the same time the ECB's security holdings increased sharply. The ECB's security holdings increased by around 400bn euros and security holdings of euro-area banks accounted for around 62% of the sales, based on approximately 250bn euros sold. Interestingly, those ECB interventions do not seem to have had a large price impact. Figure 1-Figure 4 plot the price indices of several targeted euro-area sovereign bonds before and after the large-scale asset purchases. The response of those price series to QE is hardly visible in terms of both magnitude and life span, suggesting that potential "net-worth" effects on bank balance sheets through higher security prices remained subdued throughout the period.

The asset purchases of the ECB (or the respective central banks) induced an asset swap of securities for banks, which sold them to the ECB, with central-bank reserves. Indeed, Figure 6 confirms that most banks increased their reserves between 2013 and 2016. The figure plots the correlation between the share of reserves out of total assets in 2013 and 2016. Banks that lie on the 45-degree line have an equal share of reserves on the balance sheet in 2016 and in 2013. Banks that have a larger share of reserves in 2016 than in 2013 are above the 45-degree line and marked in green, while those that have a smaller share of reserves are below the 45-degree line and marked in red. The size of the bubble reflects the size of the reserves. The graph shows that most banks have a larger share of reserves in 2016, which yield negative interest rates, than in

¹¹Data ID: 10.12757/BBk.BISTA.99Q1-19Q4.01.01

2013, when the ECB's deposit facility rate was still zero.

This increase in reserves was stronger for banks with greater exposure to QE due to higher (pre-determined) security ratios, consistent with the idea that asset purchases swap securities with reserves on banks' balance sheets, as can be seen in the upper left panel of Figure 7. Banks that had more securities in 2013 were more exposed to QE and sold more securities in the course of the QE implementation, leading to a stronger reduction in security holdings, as shown in the bottom right panel. We label such banks with higher pre-determined security ratios as "treated" more heavily by the ECB's asset-purchase programs. The upper right panel of Figure 7 and the bottom left panel also show that banks that had larger pre-existing security ratios increased their interbank lending and the sum of interbank lending and reserves by more.

Taken together, the evidence suggests that high-security banks end up holding more negative interest-rate bearing assets relative to banks with less exposure to QE. In addition, liquid securities are not only replaced by central-bank reserves on affected banks' balance sheets, but the latter also become more active in (liquid) interbank lending. This raises the question to what extent high-security banks' treatment under QE affects their credit provision to the non-financial sector, to which we turn next.

4 Evidence from Syndicated Lending

4.1 Empirical Setup

In this section, we analyze syndicated lending by banks in the euro area. In particular, we study the lending behavior of banks that are differentially exposed to the negative interest-rate policy and to asset-purchase programs.

As pointed out by, among others, Brunnermeier and Koby (2018) and Heider, Saidi, and Schepens (2019), banks tend to face a zero lower bound on retail deposit rates, as they are either reluctant, or it is impossible for them, to lower deposit rates to below zero in spite of the monetary-policy rate having crossed that threshold. If banks set a rate below this "reversal" rate (for example zero), customers may withdraw their deposits. As this friction is not present for wholesale deposits, banks that rely more on retail deposit funding are more likely to be negatively affected by negative interest rates on central-bank reserves. This can then through a reduction in profits

¹²In section 6, we provide more direct evidence for German banks, and thereby confirm, that pre-existing security holdings predict the selling of securities and a swap of securities with reserves when QE is implemented.

halt bank lending. Consequently, following Heider, Saidi, and Schepens (2019), we define banks' exposure to negative monetary-policy rates by their deposits-to-assets ratio.

Analogously, as argued before, banks that have a higher security ratio are more exposed to asset-purchase programs. First, they are more likely to be positively affected through asset-price appreciation than banks with lower security ratios (Brunnermeier and Sannikov, 2016). Second, banks with higher security ratios are more affected through a substitution of securities with central-bank reserves. For example, if the central bank buys 10% of the securities of each bank, a bank with a security ratio of 10% has 1% of its assets in central-bank reserves, whereas a bank with 20% securities on its balance sheet has 2% of its assets converted into central-bank reserves. If central-bank reserves yield negative rates and banks are unable to pass on the negative interest rates to their customers, a larger exposure to asset-purchase programs can reduce bank profitability and, thus, lead to a reduction in credit supply.

To test whether banks that are more exposed to both QE and negative monetary-policy rates behave differently in terms of their lending behavior, we estimate the following regression specification:

$$Log(Amount)_{i(l),j(l),t(l)} = \beta_1 QE \times Security \ Ratio_i + \beta_2 QE \times Deposit \ Ratio_i$$

$$+ \beta_3 QE \times Security \ Ratio_i \times Deposit \ Ratio_i$$

$$+ \alpha_i + \alpha_{m(t),i} + \alpha_{m(t),c} + \epsilon_{i,i,t},$$

$$(1)$$

where $Amount_{i(l),j(l),t(l)}$ is the amount lent by bank i to borrower j at date t in loan package l. QE is a standardized measure of the asset purchases, unless indicated otherwise. $Security\ Ratio_i$ is the share of securities over assets of bank i held in 2012, and $Deposit\ Ratio_i$ is the share of deposits over assets of bank i in 2012. The sample spans the time period from the introduction of negative monetary-policy rates (2014) to 2020. Standard errors are clustered at the bank level.

Importantly, we include borrower-time and (banks') country-time fixed effects to control for credit demand and time-varying unobservable characteristics at the level of the country in which a given bank i is incorporated that could drive our results.

4.2 Baseline Results

Table 1 shows the results from estimating (1) with different variants of QE.¹³ All specifications yield a negative estimate of β_3 , indicating that banks that are more exposed to both QE and negative monetary-policy rates lend less in response to asset-purchase programs than their less exposed counterparts. This result is robust to different definitions of QE. In columns 1 to 3, we define $QE_{c,m(t)}$ as the government-bond purchases of country c in a given month m(t), divided by the respective country's banks' total security holdings in 2012. This can be seen as a measure of the absorption of securities relative to a pre-existing stock. This is our baseline measure and is a "flow" measure of QE.¹⁴ In column 3, instead of scaling the asset purchases of government bonds with the 2012 securities held by banks in a given country, we scale the purchases with the one-month lagged security holdings of the banking sector.

Our estimate of β_3 is virtually invariant across the first three columns, where we additionally vary the set of fixed effects. In column 1, we control for bank and borrower-time fixed effects. The latter are included so as to control for time-varying unobserved heterogeneity at the borrower level, including but not limited to loan demand (Jiménez, Ongena, Peydró, and Saurina, 2014; Khwaja and Mian, 2008). Effectively, we identify our effect using firms that borrow in the same month from different banks. Thus, to the extent that credit demand does not vary across banks, the lending from banks to firms can be attributed to credit supply rather than credit demand. To estimate a regression with such firm-month fixed effects, we implicitly restrict our sample to firms that borrow at least from two banks at the same time. However, as we focus on syndicated loans, which by definition are made by a syndicate of banks, this restriction is innocuous. In all remaining columns, we also include bank i's country by time fixed effects, which control for time-varying unobserved heterogeneity associated with a given bank's country.

In columns 4 and 5, we use the log of the monthly purchases in a country and overall, respectively, instead of the scaled monthly purchases. In columns 6 and 7, we use the log of holdings rather than the purchases, i.e., a stock measure of QE rather than a flow measure, in a country and overall, respectively. Across all specifications, our coefficient ranges from -0.95 to -0.62. In terms of economic magnitudes, a bank with a 50% security and a 50% deposit ratio (0.25) relative

¹³Table 1 only displays the coefficient on the triple interaction, as the double-interaction terms are difficult to interpret when the triple interaction is included. For completeness, we re-estimate Equation 1 without the triple interaction in Table A1.

¹⁴D'Amico and King (2013) show that there are both flow and stock effects of QE.

¹⁵In section 6, when using microdata on general bank-firm lending relationships, we relax the assumption that firms need to borrow from at least two banks.

to a bank with a 40% security and a 40% deposit ratio (0.16) lends between 8.55% (= 0.09×0.95) and 5.58% (= 0.09×0.62), multiplied by QE, less. To measure an average effect on credit supply, we redefine QE in column 8 to be an indicator variable that equals one during the quantitative-easing period. The respective coefficient on the triple interaction implies an almost 20% difference in lending.¹⁶

One concern in the above specification could be that banks that have a large exposure to QE and negative rates are also different in terms of other characteristics that may govern bank lending over time. To investigate this, in Table 2, we regress bank characteristics in 2012 on the interaction between the security ratio and the deposit ratio in the cross-section of banks. Affected banks, i.e., those with high security and deposit ratios, do not differ substantially in terms of other common bank characteristics, such as total assets, capitalization, or profitability. As such, it does not come as a surprise that our estimates are robust to including interaction terms of our *QE* measure with the above-mentioned control variables (Table 3).

In Table 4, we re-estimate our baseline specification for a longer time period (starting in 2010), and replace the QE treatment variable with an indicator variable $Post_t$ that is equal to one starting with the introduction of negative monetary-policy rates in the euro area (June 11, 2014). Given that the QE and the negative interest-rate periods roughly coincide, we effectively replace our QE treatment-intensity variable with a dummy variable for non-zero asset purchases by the ECB. The results show that banks that are more exposed through their balance sheet (higher deposit and security ratios) to both negative interest rates and QE lend less during the negative interest-rate period than before compared to less exposed banks. This holds after controlling for various fixed effects, such as borrower-month and country-month fixed effects. Therefore, we can conclude that banks' exposure to negative interest rates through their funding structure and to quantitative easing is jointly instrumental in explaining their lending behavior: there are no effects on lending by banks with high security and deposit ratios prior to the implementation of these monetary policies.

Figure 8 plots the coefficient on the triple interaction annually between 2010 and 2019. Before the introduction of negative monetary-policy rates, there is no substantial difference in the credit supply as a function of banks' exposure to negative monetary-policy rates and QE. This absence of a pre-trend, combined with a strong decline in the coefficient once negative interest rates

¹⁶Table A1 shows that banks with a higher ex-ante security ratio did not increase their corporate lending when QE was implemented, which is in line with the limited overall price (or "net-worth") effect of QE purchases in the euro area.

(red vertical line) and QE (purple dashed line) are introduced, lends support to our identifying assumption that banks more exposed to QE and negative rates would not have been on different trajectories absent the introduction of these policies.

Instead of comparing a (long) pre-negative-rates period ($Post_t = 0$) with a post-negative-rates period ($Post_t = 1$), one can also estimate the effect of each (additional) cut into negative rates. For this purpose, we replace the indicator variable $Post_t$ with the actual deposit facility rate. As the latter was actually zero in 2012, we start the sample period then.¹⁷ The results are in Table 5. In line with our estimates in Table 4, the coefficient on the triple interaction is positive, implying that lower, negative deposit facility rates are associated with less lending by affected relative to less affected banks.

Brunnermeier and Koby (2018) argue that interest-rate cuts are more effective before QE than after QE, as banks benefit less from capital gains when fewer securities are on their balance sheet. To test this, Table 6 explores further heterogeneity in terms of the response to negative interest-rate cuts before and after QE was introduced, by estimating a staggered difference-in-differences specification. For this purpose, we split our sample into four periods: (1) a pre-period, (2) an NIRP CUT BEFORE QE_t period, (3) a QE_t period, and (4) an NIRP CUT AFTER QE_t period.

Table 6 shows, indeed, that banks that are more exposed to QE and negative interest rates do not lend less than do their counterparts after the first cut into negative territory without QE implemented at the same time. When in addition to negative interest rates QE is implemented, treated banks lend less than their counterparts, but the effect becomes even stronger when the ECB cuts the deposit facility rate further into negative territory, i.e., after negative monetary-policy rates have already been implemented and QE has been conducted.

5 Equity Returns

In this section, we estimate the reaction of bank stock prices in response to asset purchases. We exploit heterogeneity in terms of exposure to the negative interest-rate policy and asset purchases by comparing banks with different deposit and security ratios. As equity returns measure expected future discounted bank profits, the response of equity returns can be indicative of profitability (English, Van den Heuvel, and Zakrajšek, 2018). To study the response of equity returns

¹⁷Our results are robust to including the deposit facility rates from 2010 and 2011, which were positive and both increased and decreased during that time period.

of high-deposit and high-security banks relative to other banks in response to asset purchases during a period of low interest rates, we estimate the following regression model:

$$Return_{i,m} = \alpha_i + \alpha_m + \beta_1 Q E_{c,m} \times Security \ Ratio_i + \beta_2 Q E_{c,m} \times Deposit \ Ratio_i + \beta_3 Q E_{c,m} \times Security \ Ratio_i \times Deposit \ Ratio_i + \epsilon_{i,m},$$
(2)

where $Return_{i,m}$ is the percentage change in the equity prices of bank i between month-year m and m-1. $QE_{c,m}$ is the log of the amount purchased of the bonds of country c that bank i resides in divided by all banks' total security holdings of country c in 2012. $Security\ Ratio_i$ is the share of securities over assets that bank i held in 2012. $Deposit\ Ratio_i$ is the share of deposits over assets of bank i in 2012. The sample period runs from 2010 to 2020. Standard errors are clustered at the bank level.

Table 7 shows the results. Banks with higher security and deposit ratios exhibit lower stock returns in response to asset purchases. Figure 9 plots the estimated stock-return response to a one-standard-deviation increase in asset purchases as a function of banks' security and deposit ratios. Banks that have a high security ratio and a high deposit ratio are estimated to have significantly lower stock returns relative to other banks with lower security or deposit ratios. For example, the most exposed bank in our sample with a deposit ratio of 89% and a security ratio of 54% is estimated to have a stock return of -11.53% in response to a one-standard-deviation increase in asset purchases. In contrast, the stock return of the least exposed bank with a security ratio of 2% and a deposit ratio of 7% is virtually insensitive to variations stemming from QE.

In Figure 10, we compare stock returns of two hypothetical banks: one that has a high share of deposits and securities (both at the 75th percentile) relative to a bank that has a low deposit and security ratio (at the 25th percentile). By construction, before the implementation of QE, stock returns of banks with differential exposure to the unconventional monetary-policy tools implemented by the ECB move in parallel. However, once the national central banks in the euro area start buying government bonds, stocks of banks with a high exposure underperform significantly. Banks that are highly exposed to QE and negative interest rates have persistently lower returns of around -4% during the QE and negative interest-rates period, while banks that are less exposed, as they have a larger wholesale-funding base and have fewer securities on their balance sheet, have constant returns of around -1% and -2%.

Negative interest rates do not bite to the same extent across countries in the euro area, as despite a common nominal interest rate on interbank funds, customer deposit rates can vary

widely (Bittner, Bonfim, Heider, Saidi, Schepens, and Soares, 2020; Heider, Saidi, and Schepens, 2021). In countries where government-bond yields are perceived as relatively risky, the overall level of interest rates (including on customer deposits) is also higher, as government bonds and bank deposits can be seen as substitutes. Consequently, we would expect our channel to be stronger in countries where the zero lower bound on deposits is more binding.

In Table 8, we exploit heterogeneity across countries in terms of their exposure to negative interest rates. First, we confirm that the result is stronger in Germany, a low-deposit-rate country, than in other countries in the euro area. When exploiting the exposure index (that is decreasing in the level of deposit rates prior to the introduction of the negative deposit facility rate) to negative interest rates, as in Bittner, Bonfim, Heider, Saidi, Schepens, and Soares (2020), we see that countries that are less exposed to negative rates (low index value) see almost no reaction in stock returns. GIIPS countries (Greece, Italy, Ireland, Spain), which happen to be, on average, less exposed to negative rates, also see a smaller response, but the effect is not statistically significant. In the last column, we show that banks' stock returns in countries that have higher bond yields ex ante also suffer less. This evidence suggests that the net-worth channel is less important for banks in these countries than for banks in countries that already have low rates before and where an increase in bond prices does not recapitalize banks as much.

Next, we zoom in on Germany, a country where deposit rates are close to the zero lower bound (high index value), and where negative monetary-policy rates are thus less likely to be passed through to bank depositors.

6 Micro Evidence from Germany

The administrative data from the Bundesbank provide us with the possibility not only to observe credit relationships with different counterparties—in particular firms and other banks—over time, but also to observe bank-level outcomes at a higher frequency. In Table 9, we use this feature of our data to confirm that German banks that are highly exposed to both the ECB's asset-purchase programs and the negative interest-rate policy wind up with more central-bank reserves (column 1), but not central-bank liabilities (column 2). This leads to an overall increase in their net central-bank assets (column 3). Finally, there is no discernible increase in deposits (column 4). In line with our estimate in column 1 of Table 8, this confirms that affected banks face an adverse shock to their net worth due to the asset swap of securities with central-bank reserves, on which they

pay a negative deposit facility rate since June 2014.

We next document whether our exposure measure for QE is actually correlated with changes in security holdings. In Table 10, we use granular data on German banks' security holdings from the Securities Holdings Statistics (SHS). In columns 1 and 2, we find a significant average effect on security holdings for all high-security banks (columns 1 and 2), as can also be seen graphically in Figure A1. However, in columns 3 and 4, we see that among high-security banks, only large banks, which we define as banks with total assets exceeding 50bn euros, with presumably better access to market makers, sell off securities from their balance sheets.

We leverage the German microdata to fine-tune the treatment variable and hence sharpen our identification. Besides, knowing that high-security banks are, in fact, more prone to selling off their holdings to the ECB validates our approach that relies on measuring banks' exposure to QE by means of their securities-to-assets ratio (as in Rodnyansky and Darmouni, 2017). In contrast, banks' funding structure, as reflected by their deposit ratio, is not relevant for their security holdings. As such, banks' reliance on deposits affects their funding costs and net worth only through their exposure to the negative interest-rate policy.

In Table 11, we use our credit-registry data at the bank-firm-quarter level (i,j,q), and estimate analogous regressions to those in our baseline Table 1, using the same definition of $QE_{c,q}$ as in the first two columns. The granularity of the data allows us to track a given bank i's loan exposure to firm j over time. As such, we can estimate the effect of banks' exposure to QE and negative rates, while controlling for both time-invariant unobserved heterogeneity at the bank-firm match level and time-varying unobserved heterogeneity at the firm level. In this manner, we can test the effect on banks' intensive margin of lending.

Despite the fact that the inclusion of firm-time fixed effects forces our identification to come from German firms in relationships with multiple banks, the estimated triple-interaction effect is similar in size to that in column 2 of Table 1, where firm-time fixed effects rather capture the fact that multiple banks come together to provide a syndicated loan. This holds, however, only for the subset of large banks in column 1 of Table 11, but not for the remaining banks in column 2. In column 3, we use the pooled sample and find that the difference in the triple-interaction effect is significantly different (at the 1% level) for these two groups of banks. In columns 4 to 6, we re-run the same regressions, except that instead of differentiating by size, we distinguish banks by their access to the repo market. Banks with access to the repo market behave like large banks, in that they reduce their lending when they are exposed to both QE and negative rates through

the securities on their asset side and their reliance on deposit funding.

These findings attest to the idea that banks' exposure to QE is contingent on their ability to sell off securities that are purchased by the ECB under the program. This is the case primarily for large banks. As a robustness check, we can replace banks' exposure to QE_q as a function of their pre-determined $Security\ Ratio_i$ by their actual change in security holdings over the course of one year, without having to limit our analysis to large banks in an attempt to proxy for banks' ability to sell off securities. Doing so, we can confirm in column 1 of Table 12 that high-deposit banks lend less following a drop in their security holdings during the ECB's asset purchases. In column 2, the effect is confined to household deposits, rather than those of non-financial corporations. This once again confirms the importance of the variation in banks' funding costs under negative monetary-policy rates, as the ZLB is more binding for households than for corporate deposits. Finally, our results are broadly robust to replacing annual changes in banks' security holdings by quarterly changes (see columns 3 and 4).

In Table 13, we re-run (almost) the same specifications as in the first two columns of Table 12, but limit the variable reflecting security changes to sales (columns 1 and 3) or purchases (columns 2 and 4). In line with high-deposit banks reducing their credit supply only when their securities are swapped with central-bank reserves, we find a statistically and economically significant coefficient on the relevant interaction term only for security sales.

As affected banks reduce their lending to non-financial corporations, this opens up the possibility that they rebalance their (loan or asset) portfolios, in particular by increasing their portion of liquid assets. This would be consistent with Diamond, Jiang, and Ma (2021) insofar as interbank loans are a means of transferring and redistributing reserves among banks, without increasing the total amount of reserves in the system.

To investigate this, we next consider the interbank portion of the German credit registry, i.e., we consider bank lending to other banks, rather than firms, excluding intra-group lending. In columns 1 and 3 of Table 14, we re-run analogous specification to those in columns 1 and 2 of Table 11. Large banks that are exposed to QE and negative rates, which we have shown to reduce their credit supply to non-financial corporations, instead expand their supply of interbank loans. In column 2, the effect is somewhat stronger, albeit insignificantly so, for interbank lending to high-yield countries. In the last two columns, we replace $Security\ Ratio_i \times QE_q$ by the actual change in security holdings over the course of one year, and find that high-deposit banks that

¹⁸See, among others, Heider, Saidi, and Schepens (2019) and Altavilla, Burlon, Giannetti, and Holton (2021).

sold off their securities during the QE period lent more to other banks in high-yield countries (column 6), but not on average (column 5).

These estimates suggest that affected banks replace illiquid loans to the real sector with liquid interbank loans on their asset side. When doing so, they possibly reach for yield in response to the adverse shock to net worth that they incur due to the negative deposit facility rate charged on their additional central-bank reserves. In Table 15, we differentiate interbank lending by large and small banks within (columns 1 and 3) and outside the euro area (columns 2 and 4). The differential lending response is confined to large affected banks and their lending to other euro-area banks. In columns 5 and 6, we test whether the lending response is significantly different for large versus small banks, and this is the case only for interbank lending within the euro area (column 5).

7 Cross-Border Interbank Flows

We next zoom in on the implications of QE under negative policy rates for the distribution of interbank liquidity in the euro area. The micro-level results in Tables 14 and 15 suggest that while German banks with greater exposure to QE and negative rates reduce their credit supply to the real sector, they expand their lending to other banks, and especially in the euro area. To investigate whether this potential reaching-for-yield behavior has any meaningful explanatory power for interbank flows between the core and the periphery in the euro area, we use aggregate data from the Bank for International Settlements, and estimate the following regression specification at the country-pair level:

$$Flow_{c,j,q} = \alpha_{i,q} + \alpha_{j,q} + \beta_1 Core_c \times GIIPS_j + \beta_2 QE_{c,t} \times Core_c \times GIIPS_j + \epsilon_{c,j,q}, \quad (3)$$

where $Flow_{c,j,q}$ is the percentage change in bank claims of (source) country c to (recipient) country j in quarter q. $QE_{c,q}$ is the amount purchased of the bonds of country c divided by the banks' total security holdings of country c in 2012. The sample starts in 2014. $Core_c$ is an indicator variable for whether the lending country c is Germany, Finland, the Netherlands, or Austria. $GIIPS_j$ is an indicator variable for whether the borrowing country j is Greece, Italy, Ireland, Spain, or Portugal. Standard errors are double-clustered at the source-country and host-country levels.

Table 16 shows the results of estimating (3). When QE is conducted, core-country banks—not

only in Germany—lend more to GIIPS-country banks. Figure 11 plots the share of borrowing of GIIPS banks from core banks in red. The black dashed line shows the ECB bond holdings of core countries. There is a strong correlation between the two measures, suggesting that QE during the negative interest-rate policy period may have led to greater financial dependence of periphery banks from the core.

8 Conclusion

This paper studies the consequences of the interaction between negative monetary-policy rates and large-scale asset purchases. We provide evidence that absorbing a large amount of securities from the banking sector in the presence of a zero lower bound on retail deposit rates reduces credit supply by deposit-dependent banks that are exposed to both QE and higher funding costs. Our results point to some important policy implications for monetary policy. As QE can exacerbate the detrimental effects of negative interest-rate policies on banks' profitability, central bankers should be cautious in combining various unconventional policies. In addition, affected banks may counteract this adverse shock to their net worth by reaching for yield in the liquid interbank market. We present suggestive evidence that this may have led to interbank flows from the core to the periphery in the euro area during the ECB's large-scale asset purchases. The potential ramifications for the financial dependence of the periphery from the core in a fragmented euro area can be far-reaching and, thus, constitute a valuable avenue for future research.

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Figures

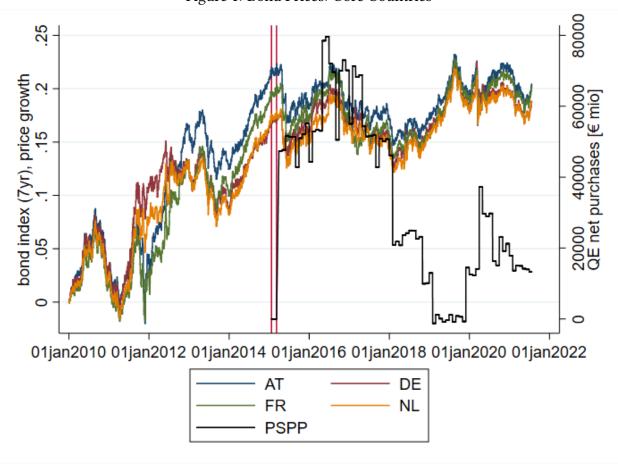


Figure 1: Bond Prices: Core Countries

Notes: This graph shows the price development of European bond indices and QE net purchases (PSPP) by the ECB expressed in million euros. The bond indices (7 year) for Austria, Germany, France and Netherlands are shown as growth relative to the beginning of 2010 (left y-axis). The QE net purchases (PSPP) by the ECB are shown in the solid black line referring to the right y-axis. The first vertical red line represents the announcement of the PSPP program (22 Jan 2015) and the second represents its implementation (9 Mar 2015).

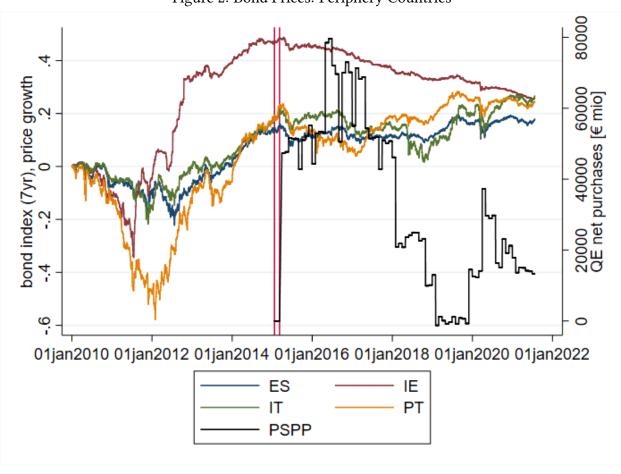


Figure 2: Bond Prices: Periphery Countries

Notes: This graph shows the price development of European bond indices and QE net purchases (PSPP) by the ECB expressed in million euros. The bond indices (7 year) for Spain, Ireland, Italy and Portugal are shown as growth relative to the beginning of 2010 (left y-axis). The QE net purchases (PSPP) by the ECB are shown in the solid black line referring to the right y-axis. The first vertical red line represents the announcement of the PSPP program (22 Jan 2015) and the second represents its implementation (9 Mar 2015).

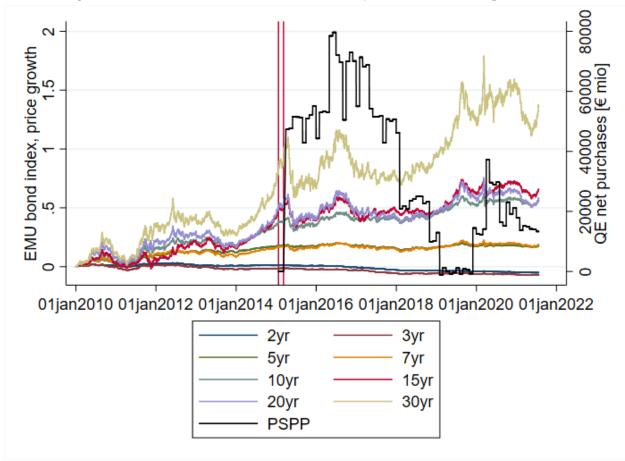


Figure 3: Bond Prices: Economic and Monetary Union of the European Union

Notes: This graph shows the price development of bond indices for the European Monetary Union (EMU) with different maturities and QE net purchases (PSPP) by the ECB expressed in million euros. The bond indices for the EMU with maturity of 2, 3, 5, 7, 10, 15, 20 and 30 years are shown as growth relative to the beginning of 2010 (left y-axis). The QE net purchases (PSPP) by the ECB are shown in the solid black line referring to the right y-axis. The first vertical red line represents the announcement of the PSPP program (22 Jan 2015) and the second represents its implementation (9 Mar 2015).

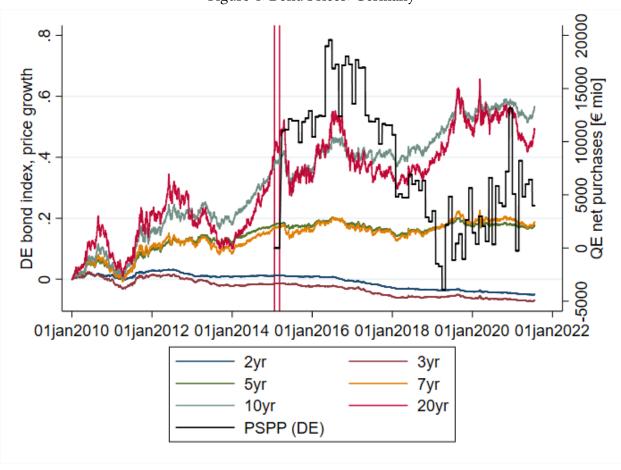


Figure 4: Bond Prices: Germany

Notes: This graph shows the price development of bond indices for Germany with different maturities and QE net purchases (PSPP) by the ECB expressed in million euros. The bond indices for Germany with maturity of 2, 3, 5, 7, 10 and 20 years are shown as growth relative to the beginning of 2010 (left y-axis). The QE net purchases (PSPP) by the ECB are shown in the solid black line referring to the right y-axis. The first vertical red line represents the announcement of the PSPP program (22 Jan 2015) and the second represents its implementation (9 Mar 2015).

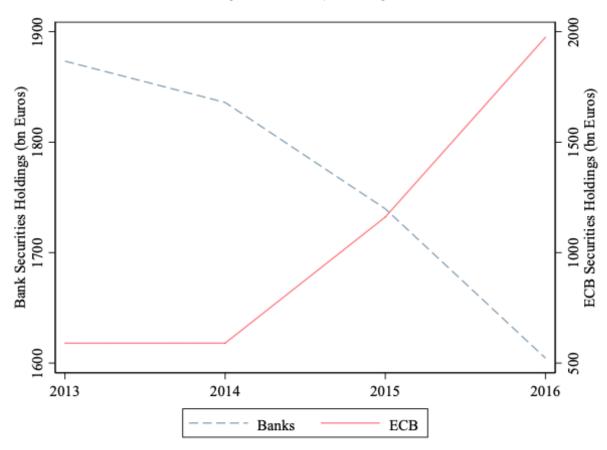


Figure 5: Security Holdings

Notes: This graph shows the security holdings of banks and the ECB in bn Euros. The security holdings of banks are shown in the dashed blue line referring to the left y-axis. The security holdings of the ECB are shown in the solid red line referring to the right y-axis.

Seserves 2013

Figure 6: Reserves Before and After QE

Notes: This graph shows the share of reserves as a percentage of total assets in 2013 (x-axis) versus the same share in 2016 (y-axis). The green (red) circles reflect banks that increased (decreased) their total reserve holdings. The size of the circle reflects the size of the reserves.

Ś Δ Interbank Lending (2016-2013) -.15 -.1 -.05 0 ∆ Reserves (2016-2013) .02 -.02 .2 Security Ratio (2013) 0 .1 .2 .3 .4 0 .1 .3 .4 Security Ratio (2013) A Reserves & Interbank (2016-2013) 8 8 Δ Security Holdings (2016-2013) -.05 0 .05 0 -.05 -.15 .2 0 0 .2 .3 .1 .3 .1

Figure 7: Δ Bank Variables against Security Ratio

Notes: The upper left panel shows a scatter plot between the change in reserves over total assets between 2013 and 2016 on the y-axis and the security ratio in 2013 on the x-axis. The upper right panel shows the change in interbank lending over total assets on the y-axis and the security ratio in 2013 on the x-axis. The bottom left panel shows the change in reserves and interbank lending over total assets on the y-axis and the security ratio in 2013 on the x-axis. The bottom right panel shows the change in security holdings over total assets on the y-axis and the security ratio in 2013 on the x-axis.

Security Ratio (2013)

Security Ratio (2013)

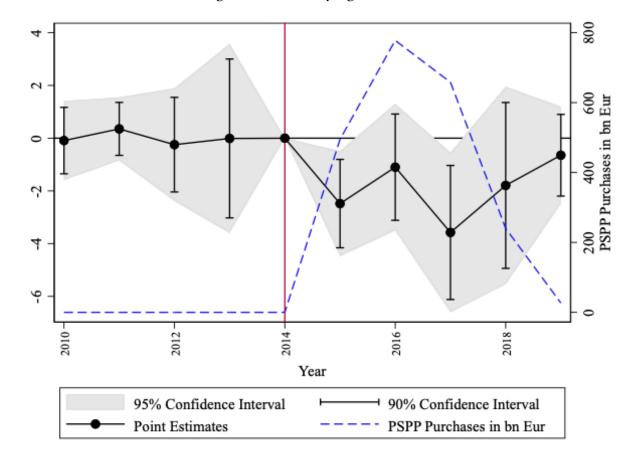


Figure 8: Time-varying Coefficients

Notes: On the left y-axis, this figure plots the estimates of $\beta_{3,\tau}$ from the following regression:

$$\begin{split} \log(Amount)_{i(l),j(l),t(l)} &= \alpha_i + \alpha_{m(t),j} + \alpha_{m(t),c} + \sum_{\tau \neq 2014} \beta_{1,\tau} \times Security \ Ratio_i \times \mathbb{1}_{[t=\tau]} \\ &+ \sum_{\tau \neq 2014} \beta_{2,\tau} \times Deposit \ Ratio_i \times \mathbb{1}_{[t=\tau]} \\ &+ \sum_{\tau \neq 2014} \beta_{3,\tau} \times Security \ Ratio_i \times Deposit \ Ratio \times \mathbb{1}_{[t=\tau]} + \epsilon_{i,j,t} \end{split}$$

The blue dashed line shows the public sector purchases of the ECB in bn Euros referring on the right y-axis.

30 20 10 Return (%) 0 -10 -20 0 0.2 -30 1 0.4 8.0 0.6 0.4 0.2 0.6 0 Securities Deposits

Figure 9: Stock-return Response to QE Purchases

Notes: This graph shows the predicted stock returns as a function of the deposit and the security ratio. The predicted stock returns come from the following regression (where QE is a one-standard-deviation QE implemention):

 $Return_{i,m} = \alpha_i + \alpha_m + \beta_1 Q E_{c,m} \times \textit{Security Ratio}_i + \beta_2 Q E_{c,m} \times \textit{Deposit Ratio}_i + \beta_3 Q E_{c,m} \times \textit{Security Ratio}_i \times \textit{Deposit Ratio}_i + \epsilon_{i,j,t} +$

2010m1 2012m1 2014m1 2016m1 2018m1 2020m1

Stock Returns of Bank with low Deposit and Security Ratio

---- Stock Returns of Bank with high Deposit and Security Ratio

Figure 10: Estimated Stock Returns

Notes: This graph shows the predicted stock returns for banks with both a low (high) deposit and security ratio, measured as 25th (75th) percentile, in red-black (solid-dash). The predicted stock returns come from the following regression (where QE is a one-standard-deviation QE implementation):

 $Return_{i,m} = \alpha_i + \alpha_m + \beta_1 Q E_{c,m} \times \textit{Security Ratio}_i + \beta_2 Q E_{c,m} \times \textit{Deposit Ratio}_i + \beta_3 Q E_{c,m} \times \textit{Security Ratio}_i \times \textit{Deposit Ratio}_i + \epsilon_{i,j,t} +$

Bank Liabilities of GIIPS from Core Countries as a share of total Cross-Border Bank Liabilities as a share of total Cross-Border Bank Liabilities

Figure 11: Cross-border Banking Flows

Notes: This graph shows the banking capital flows from Core to GIIPS countries and the ECB bond holdings of Core countries over time.

Tables

Table 1: Syndicated-lending Response by Banks with Different Exposure to QE and Negative Rates

<u> </u>		1 /		1	~			
	Dependent Variable: Lending							
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
QE × Security Ratio × Deposit Ratio	-0.815**	-0.938**	-0.950**	-0.949***	-0.954***	-0.633**	-0.622**	-2.006**
	(0.309)	(0.448)	(0.468)	(0.347)	(0.332)	(0.286)	(0.273)	(0.804)
R-squared	0.975	0.976	0.976	0.975	0.975	0.976	0.976	0.976
N	6382	6311	6311	5913	5863	6311	6311	6311
Bank FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Borrower \times Month FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Country \times Month FE	_	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Specification	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),2012}}$	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),2012}}$	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),m(t)-1}}$	$ln(App_{c(i),m(t)})$	$ln(App_{m(t)})$	$ln(H_{c(i),m})$	$ln(H_{m(t)})$	QEDummy

Notes: The level of observation is credit to firm j by bank i in country c on day t. The sample period is 2014 to 2020. The dependent variable is the natural logarithm of the euro amount of debt issued between firm j and bank i on day t. QE measures the implementation of the public sector purchase programme (PSPP) of the ECB. In columns (1)-(2), $QE_{c,m(t)}$ is the log of the purchased amount of the bonds of country c in month-year m(t) divided by all banks' total security holdings of country c in 2012. In column (3), $QE_{c,m(t)}$ has the same numerator, but is now scaled by the banks' total security holdings of country c in the previous month-year. In column (4), $QE_{m(t)}$ is the log amount of government bonds of country c purchased by the ECB in month-year m(t). In column (5), $QE_{m(t)}$ is the log amount of all government bonds purchased by the ECB in month-year m(t). In column (7), $QE_{m(t)}$ is the log of the amount of all government bonds held by the ECB in month-year m(t). In column (8), $QE_{m(t)}$ is a dummy equal to one after March 2015. Security Ratio_i is the share of securities over assets a bank held in 2012. Deposit Ratio_i is the share of deposits over assets of a bank in 2012. The various double interactions between the three variables Deposit Ratio_i, Security Ratio_i and $QE_{(c,m(t))}$ are included in the regression, but are not reported in the table. Standard errors are clustered at the bank level.

Table 2: Correlation of Bank-level Exposure Variables with Other Balance-sheet Characteristics

	(1)	(2)	(3)	(4)	(5)
	Log(Assets)	Capital Ratio	T1 Capital Ratio	RoA	RoC
Security Ratio	3.228	0.00289	-0.0208	-0.0476	93.28
	(3.865)	(0.096)	(0.064)	(0.030)	(223.547)
Deposit Ratio	-2.028	0.0308	0.0442**	-0.0120	-27.46
	(1.532)	(0.030)	(0.020)	(0.012)	(69.741)
Security Ratio × Deposit Ratio	-4.821	0.0523	-0.00358	0.0848	47.59
•	(6.988)	(0.153)	(0.102)	(0.054)	(356.948)
R-squared	0.171	0.114	0.230	0.0471	0.0255
N	66	60	50	66	52

Notes: The level of observation is at the bank-level in 2012. The dependent variable is (1) log assets $(Log(Assets_i))$, (2) the simple capital ratio $(Capital\ Ratio_i)$, (3) the Tier 1 capital ratio $(T1\ Capital\ Ratio_i)$, (4) the return on assets (RoA_i) , and (5) the return on capital (RoC_i) . Security $Ratio_i$ is the share of securities over assets a bank held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012.

Table 3: Syndicated-lending Response by Banks with Different Exposure to QE and Negative Rates—Robustness

	Dependent Variable: Lending							
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
QE × Security Ratio × Deposit Ratio	-1.227**	-1.100**	-1.143**	-1.141**	-1.117**	-0.808**	-0.790**	-2.434**
	(0.462)	(0.506)	(0.532)	(0.432)	(0.433)	(0.376)	(0.360)	(0.994)
R-squared	0.975	0.976	0.976	0.975	0.975	0.976	0.976	0.976
N	6362	6291	6291	5893	5844	6291	6291	6291
Bank FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Borrower \times Month FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
$Country \times Month FE$	_	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Specification	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),2012}}$	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),2012}}$	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),m(t)-1}}$	$ln(App_{c(i),m(t)})$	$ln(App_{m(t)})$	$ln(H_{c(i),m})$	$ln(H_{m(t)})$	QEDummy
Interacted Controls	√	✓ "	√	\checkmark	\checkmark	\checkmark	\checkmark	✓

Notes: The level of observation is credit to firm j by bank i in country c on day t. The sample period is 2014 to 2020. The dependent variable is the natural logarithm of the euro amount of debt issued between firm j and bank i on day t. QE measures the implementation of the public sector purchase programme of the ECB. In columns (1)-(2), $QE_{c,m(t)}$ is the log of the purchased amount of the bonds of country c in month-year m(t) divided by all banks' total security holdings of country c in 2012. In column (3), $QE_{c,m(t)}$ has the same numerator, but is now scaled by the banks' total security holdings of country c in the previous month-year. In column (4), $QE_{m(t)}$ is the log amount of government bonds of country c purchased by the ECB in month-year m(t). In column (5), $QE_{m(t)}$ is the log amount of all government bonds purchased by the ECB in month-year m(t). In column (7), $QE_{m(t)}$ is the log of the amount of all government bonds held by the ECB in month-year m(t). In column (8), $QE_{m(t)}$ is a dummy equal to one after March 2015. Security Ratio; is the share of securities over assets a bank held in 2012. Deposit Ratio; is the share of deposits over assets of a bank in 2012. The various double interactions between the three variables Deposit Ratio;, Security Ratio; and $QE_{(c),m(t)}$ are included in the regression but are not reported in the table as they are difficult to interpret. The results without the triple interaction can be found in Table A1. All regressions include the interaction between $QE_{c,m(t)}$ and the following control variables as of 2012: (1) log assets $(Log(Assets_i))$, (2) the simple capital ratio $(Capital\ Ratio_i)$, (3) the Tier 1 capital ratio $(T1\ Capital\ Ratio_i)$, (4) the return on assets (RoA_i) , and (5) the return on capital (RoC_i) . Standard errors are clustered at the bank level.

Table 4: Syndicated-lending Response by Banks with Different Exposure to QE—Before vs. After Introduction of Negative Rates

	Dependent Variable: Lending				
	(1)	(2)	(3)		
Post × Security Ratio × Deposit Ratio	-1.405**	-1.595*	-2.016**		
	(0.661)	(0.882)	(0.971)		
R-squared	0.975	0.976	0.976		
N	8311	8213	8181		
Bank FE	\checkmark	\checkmark	\checkmark		
Borrower \times Month FE	\checkmark	\checkmark	\checkmark		
Country \times Month FE	-	\checkmark	\checkmark		
Interacted Controls	=	-	\checkmark		

Notes: The level of observation is credit to firm j by bank i in country c on day t. The sample period is 2010 to 2020. The dependent variable is the natural logarithm of the euro amount of debt issued between firm j and bank i on day t. $Post_t$ is a dummy that equals one after the ECB introduced negative interest rates (June 11, 2014). Security $Ratio_i$ is the share of securities over assets a bank held in 2012. $Deposit\ Ratio_i$ is the share of deposits over assets of a bank in 2012. The various double interactions between the three variables $Deposit\ Ratio_i$, $Security\ Ratio_i$ and $Post_t$ are included in the regression but are not reported in the table. Column (3) includes the interaction between $Post_t$ and the following control variables as of 2012: (1) $log\ assets\ (Log(Assets_i))$, (2) the simple capital ratio ($Capital\ Ratio_i$), (3) the Tier 1 capital ratio ($Capital\ Ratio_i$), (4) the return on assets ($Capital\ Ratio_i$), and (5) the return on capital ($Capital\ Ratio_i$). Standard errors are clustered at the bank level.

Table 5: Syndicated-lending Response by Banks with Different Exposure to QE—Interaction with Deposit Facility Rate

	Dependent Variable: Lending			
	(1)	(2)	(3)	
Deposit Facility × Security Ratio × Deposit Ratio	3.154*	3.516	4.571**	
	(1.704)	(2.105)	(2.239)	
R-squared	0.975	0.976	0.976	
N	8311	8213	8181	
Bank FE	\checkmark	\checkmark	\checkmark	
Borrower \times Month FE	\checkmark	\checkmark	\checkmark	
Country \times Month FE	-	\checkmark	\checkmark	
Interacted Controls	-	-	\checkmark	

Notes: The level of observation is credit to firm j by bank i in country c on day t. The sample period is 2012 to 2020. The dependent variable is the natural logarithm of the euro amount of debt issued between firm j and bank i on day t. Deposit Facility_t is the ECB's deposit facility rate. Security Ratio_i is the share of securities over assets a bank held in 2012. Deposit Ratio_i is the share of deposits over assets of a bank in 2012. The various double interactions between the three variables Deposit Ratio_i, Security Ratio_i and Deposit Facility_t are included in the regression but are not reported in the table. Column (3) includes the interaction between Deposit Facility_t and the following control variables as of 2012: (1) log assets ($Log(Assets_i)$), (2) the simple capital ratio ($Capital Ratio_i$), (3) the Tier 1 capital ratio ($T1 Capital Ratio_i$), (4) the return on assets (RoA_i), and (5) the return on capital (RoC_i). Standard errors are clustered at the bank level.

Table 6: Syndicated-lending Response by Banks with Different Exposure to QE—Staggered Implementation of Negative Rates

	Depender	Dependent Variable: Lending			
	(1)	(2)	(3)		
1 NIRP CUT BEFORE QE × Security Ratio × Deposit Ratio	0.0390	-0.0785	-0.0728		
	(0.656)	(0.924)	(0.922)		
$2 \text{ QE} \times \text{Security Ratio} \times \text{Deposit Ratio}$	-2.404***	-2.278*	-2.461*		
	(0.804)	(1.239)	(1.243)		
3 NIRP CUT AFTER QE \times Security Ratio \times Deposit Ratio	-1.191**	-1.280**	-1.264**		
	(0.576)	(0.534)	(0.533)		
R-squared	0.977	0.978	0.978		
N	10278	10148	10116		
Bank FE	\checkmark	\checkmark	\checkmark		
Borrower \times Month FE	\checkmark	\checkmark	\checkmark		
Country × Month FE	-	\checkmark	\checkmark		
Interacted Controls	-	-	\checkmark		

Notes: The level of observation is credit to firm j by bank i in country c on day t. The sample period is 2014 to 2020. The dependent variable is the natural logarithm of the euro amount of debt issued between firm j and bank i on day t. $NIRP\ CUT\ BEFORE\ QE_t$ is a dummy that equals 1 after negative interest rates were introduced and before QE was implemented. QE_t is a dummy that equals 1 after QE was implemented and before further interest rate cuts (with QE) were implemented. $NIRP\ CUT\ AFTER\ QE_t$ is a dummy that equals 1 after further interest rate cuts (with QE) were implemented. Security $Ratio_i$ is the share of securities over assets a bank held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012. The various double interactions between the three variables $Deposit\ Ratio_i$, $Security\ Ratio_i$ and the QE indicators are included in the regression but are not reported in the table. Column (3) includes the interaction between the QE indicators and the following control variables as of 2012: (1) log assets $(Log(Assets_i))$, (2) the simple capital ratio $(Capital\ Ratio_i)$, (3) the Tier 1 capital ratio $(T1\ Capital\ Ratio_i)$, (4) the return on assets (RoA_i) , and (5) the return on capital (RoC_i) . Standard errors are clustered at the bank level.

Table 7: Effect on Profitability of Banks with Different Exposure to QE and Negative Rates

	Dependent Variable: Stock Return					
	(1)	(2)	(3)	(4)	(5)	
QE × Security Ratio × Deposit Ratio	-0.341**	-0.327**	-0.314**	-0.342***	-0.374**	
	(0.160)	(0.145)	(0.130)	(0.104)	(0.166)	
R-squared	0.0102	0.0250	0.323	0.337	0.342	
N	2013	2013	2013	2013	1925	
Bank FE	-	\checkmark	-	\checkmark	\checkmark	
Time FE	=	=	\checkmark	\checkmark	\checkmark	
Interacted Controls	_	_	-	-	\checkmark	

Notes: The level of observation is the monthly stock return of bank i in country c in in month-year m. The sample period is 2010 to 2020. $QE_{c,m(t)}$ is the log of the purchased amount of the bonds of country c in month-year m(t) divided by all banks' total security holdings of country c in 2012. $Security\ Ratio_i$ is the share of securities over assets a bank held in 2012. $Security\ Ratio_i$ is the share of deposits over assets of a bank in 2012. The various double interactions between the three variables $Security\ Ratio_i$, $Security\ Ratio_i$ and $Security\ Ratio_i$ are included in the regression but are not reported in the table. $Security\ Ratio_i$ and $Security\ Ratio_i$ and the following control variables as of 2012: (1) log assets $Security\ Ratio_i$, (2) the simple capital ratio $Securital\ Ratio_i$, (3) the Tier 1 capital ratio $Securital\ Ratio_i$, (4) the return on assets $Securital\ Ratio_i$, and (5) the return on capital $Securital\ Ratio_i$. $Security\ Ratio_i$ are clustered at the bank level.

Table 8: Effect on Profitability of Banks with Different Exposure to QE and Negative Rates—Heterogeneity across Countries

	Dependent Variable: Stock Return						
	(1)	(2)	(3)	(4)			
QE × Security Ratio × Deposit Ratio	-3.352***	-1.296**	-0.380**	-1.970***			
	(0.428)	(0.494)	(0.159)	(0.538)			
QE \times Security Ratio \times Deposit Ratio \times Risky	3.011***	1.000**	0.663	0.542^{*}			
	(0.490)	(0.391)	(0.550)	(0.289)			
R-squared	0.343	0.343	0.343	0.366			
N	1925	1925	1925	1673			
Bank FE	\checkmark	\checkmark	\checkmark	\checkmark			
Month FE	\checkmark	\checkmark	\checkmark	\checkmark			
Interacted Controls	\checkmark	\checkmark	\checkmark	\checkmark			
Risky	Not Germany	Low Index	GIIPS	Bond Yields			

Notes: The level of observation is the monthly stock return of bank i in country c in in month-year m. The sample period is 2010 to 2020. $QE_{c,m(t)}$ is the log of the purchased amount of the bonds of country c in month-year m(t) divided by all banks' total security holdings of country c in 2012. Security $Ratio_i$ is the share of securities over assets a bank held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012. $Risky_c$ captures the riskiness of the country where the bank i is located. $Risky_c$ is defined as all countries except for Germany in column (1), a dummy for a low (below median) Bittner, Bonfim, Heider, Saidi, Schepens, and Soares (2020) index in column (2), indicating a low exposure to negative interest rates, a dummy for a GIIPS (Greece, Italy, Ireland, Spain) country in column (3), and the government bond yield of the country in 2014 in column (4). The various interactions between Deposit $Ratio_i$, $Security Ratio_i$, $QE_{c,m(t)}$ and $Risky_c$ are included in the regression but are not reported in the table. Standard errors are clustered at the bank level.

Table 9: Effect on Balance Sheets of Banks with Different Exposure to QE and Negative Rates

	CB assets	CB liabilities	CB net assets	deposits
	(1)	(2)	(3)	(4)
$\overline{QE \times Security Ratio \times Deposit Ratio}$	0.0297**	0.000787	0.0238*	0.0133
	(0.0138)	(0.00535)	(0.0139)	(0.00915)
R-squared	0.648	0.721	0.661	0.953
N	19285	19285	19091	19283
Bank FE	\checkmark	\checkmark	\checkmark	\checkmark
Time FE	\checkmark	\checkmark	\checkmark	\checkmark

Notes: The level of observation is bank i in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable in column (1), CB assets $_{i,q}$, is defined as central bank assets of bank i at quarter q divided by total assets of bank i in 2012. The dependent variables in columns (2)-(4) are constructed similarly, where the numerator is central bank liabilities of bank i at quarter q (CB liabilities $_{i,q}$ in column 2), central bank assets minus liabilities of bank i at quarter q (CB net assets $_{i,m}$ in column 3) and deposits ($Deposits_i$ in column 4). QE_q is the amount of German government bonds purchased by the ECB in quarter q divided by all banks' total German sovereign bond holdings in 2012. Security $Ratio_i$ is the share of securities over assets a bank held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012. Standard errors are clustered at the bank level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, balance-sheet statistics (BISTA).

Table 10: Security Holdings of Banks with Different Exposure to QE and Negative Rates

<u>.</u>					~			
	Dependent Variable: Security Holdings							
	(1)	(2)	(3)	(4)	(5)	(6)		
QE × Security Ratio	-0.150***	-0.162***	-0.266***	-0.290***	-0.112	-0.135		
	(0.047)	(0.046)	(0.077)	(0.075)	(0.094)	(0.099)		
R-squared	0.952	0.974	0.932	0.950	0.955	0.985		
N	3625419	3602180	1797212	1787733	1825439	1814447		
Bank FE	\checkmark	-	\checkmark	-	\checkmark	-		
Security FE	\checkmark	-	\checkmark	-	\checkmark	-		
Time FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark		
Bank × Security FE	-	\checkmark	-	\checkmark	-	\checkmark		
Sample	full	full	large banks	large banks	small banks	small banks		

Notes: The level of observation is bank i's holdings in security s in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable is the natural logarithm of the euro amount held in security s by bank i in quarter q. QE_q is the amount of German government bonds purchased by the ECB in quarter q divided by all banks' total German sovereign bond holdings in 2012. Security $Ratio_i$ is the share of securities over assets a bank held in 2012. A bank i is considered to be a $Large\ Bank_i$ when total assets exceed 50bn euros in 2012. Otherwise, the bank is a $Small\ Bank_i$. Standard errors are clustered at the bank level and security level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, Security Holdings Statistics (SHS), and balance-sheet statistics (BISTA).

Table 11: Credit-supply Response by Banks with Different Exposure to QE and Negative Rates—Credit-registry Evidence

	Dependent Variable: Lending						
	(1)	(2)	(3)	(4)	(5)	(6)	
QE × Security Ratio× Deposit Ratio	-2.071**	0.0358	0.0360	-3.166***	0.0785	0.0749	
	(0.720)	(0.057)	(0.058)	(0.333)	(0.062)	(0.064)	
Large Bank \times QE \times Security Ratio \times Deposit Ratio			-2.113***				
			(0.802)				
Repo Bank \times QE \times Security Ratio \times Deposit Ratio						-3.665***	
						(0.369)	
R-squared	0.920	0.945	0.934	0.917	0.946	0.934	
N	353363	1272435	1963138	307312	1342966	1963138	
Bank \times Firm FE	\checkmark	✓	\checkmark	\checkmark	\checkmark	\checkmark	
$Firm \times Time FE$	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	
Sample	large banks	small banks	full	repo banks	non repo banks	full	

Notes: The level of observation is credit to firm j by bank i (reporting requirement in the German credit register) in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable is the natural logarithm of the euro amount outstanding between firm j and bank i in quarter q. QE_q is the amount of German government bonds purchased by the ECB in quarter q divided by all banks' total German sovereign bond holdings in 2012. Security $Ratio_i$ is the share of securities over assets a bank held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012. A bank i is considered to be a $Large\ Bank_i$ when total assets exceed 50bn euros in 2012. Otherwise, the bank is a $Small\ Bank_i$. A bank i is considered a $Repo\ Bank_i$ when the bank conducts repo transactions. Otherwise, the bank is a $Non\ Repo\ Bank_i$. Standard errors are clustered at the bank level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, German credit register (BAKIS-M), and balance-sheet statistics (BISTA).

Table 12: Credit-supply Response by Banks with Different Exposure to QE and Negative Rates—Robustness

	Dep	endent Va	riable: Leno	ding
	(1)	(2)	(3)	(4)
Deposit Ratio \times Δ log securities (one year)	0.127*			
	(0.070)			
Deposit Ratio HH $ imes$ Δ log securities (one year)		0.130*		
		(0.076)		
Deposit Ratio NFC \times Δ log securities (one year)		0.0886		
		(0.229)		
Deposit Ratio \times Δ log securities (one quarter)			0.125	
			(0.082)	
Deposit Ratio HH \times Δ log securities (one quarter)				0.168**
				(0.081)
Deposit Ratio NFC \times Δ log securities (one quarter)				-0.456**
Deposit Natio IVI C × 21 log securities (one quarter)				(0.205)
R-squared	0.938	0.938	0.938	0.938
N	1671560	1671560	1714208	1714208
$\operatorname{Bank} imes \operatorname{Firm} \operatorname{FE}$	\checkmark	\checkmark	\checkmark	\checkmark
$\overline{\text{Firm} \times \text{Time FE}}$	✓	✓	✓	✓

Notes: The level of observation is credit to firm j by bank i (reporting requirement in the German credit register) in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable is the natural logarithm of the euro amount outstanding between firm j and bank i in quarter q. $\Delta \log securities_{i,q}$ is the change in log security holdings of bank i from q to q minus one year (one quarter respectively). Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012. This term is split up into household deposits (Deposit $Ratio\ HH_i$) and deposits from non-financial corporates (Deposit $Ratio\ NFC_i$). Standard errors are clustered at the bank level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, German credit register (BAKIS-M), and balance-sheet statistics (BISTA).

Table 13: Credit-supply Response by Banks with Different Exposure to QE and Negative Rates—Robustness, Buying vs. Selling

7 7 0	D.	1 , 77	• 11 т	1.	
	Dependent Variable: Lending				
	(1)	(2)	(3)	(4)	
Deposit Ratio $\times \Delta$ log securities (one year)	0.201**	0.0232			
	(0.080)	(0.059)			
Deposit Ratio HH $ imes$ Δ log securities (one year)			0.202**	0.0287	
			(0.088)	(0.056)	
Deposit Ratio NFC $ imes \Delta$ log securities (one year)			0.188	-0.0665	
			(0.277)	(0.334)	
R-squared	0.943	0.949	0.943	0.949	
N	780780	633571	780780	633571	
Bank \times Firm FE	\checkmark	\checkmark	\checkmark	\checkmark	
$Firm \times Time FE$	\checkmark	\checkmark	\checkmark	\checkmark	
change in securities	sell	buy	sell	buy	

Notes: The level of observation is credit to firm j by bank i (reporting requirement in the German credit register) in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable is the natural logarithm of the euro amount outstanding between firm j and bank i in quarter q. $\Delta \log securities_{i,q}$ is the change in log security holdings of bank i from q to q minus one year. Deposit Ratio is the share of deposits over assets of a bank in 2012. This term is split up into household deposits (Deposit Ratio HH_i) and deposits from non-financial corporates (Deposit Ratio NFC_i). The analysis is split for banks selling securities ($\Delta Securities_{i,q} < 0$, columns (1) and (3)) and banks buying securities ($\Delta Securities_{i,q} > 0$, columns (2) and (4)). Standard errors are clustered at the bank level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, German credit register (BAKIS-M), and balance-sheet statistics (BISTA).

Table 14: Interbank Lending by Banks with Different Exposure to QE and Negative Rates

			~		0	
		Dependent Variable: Lending				
	(1)	(2)	(3)	(4)	(5)	(6)
QE × Security Ratio × Deposit Ratio	4.334*	4.890*	-0.0959	-0.0353		
	(2.021)	(2.248)	(0.114)	(0.186)		
$QE \times Security Ratio \times Deposit Ratio \times Yield$		0.129		-0.0463		
		(0.662)		(0.126)		
Δ log Security Ratio (one year) $ imes$ Deposit Ratio					0.0449	0.132
					(0.181)	(0.184)
Δ log Security Ratio (one year) \times Deposit Ratio \times Yield						-0.0862**
						(0.0414)
R-squared	0.881	0.881	0.893	0.893	0.894	0.894
N	40794	40794	524170	524170	514486	514486
Bank (lender) × Bank (borrower) FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Bank (borrower) \times Time FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
Sample	large banks	large banks	small banks	small banks	full	full

Notes: The level of observation is credit to bank (borrower) j by bank (lender) i (reporting requirement in the German credit register) in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable is the natural logarithm of the euro amount outstanding between bank j (borrower) and bank i (lender) in quarter q. QE_q is the amount of German government bonds purchased by the ECB in quarter q divided by all banks' total German sovereign bond holdings in 2012. Security $Ratio_i$ is the share of securities over assets a bank (lender) held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank (lender) in 2012. Yield_c is the yield of long-term (10 year) government bonds of the borrower's country prior to the introduction of negative policy rates. $\Delta \log securities_{i,q}$ is the change in log security holdings of bank (lender) i from q to q minus one year. A bank (lender) is considered to be a Large $Bank_i$ when total assets exceed 50bn euros in 2012. Otherwise, the bank is a $Small\ Bank_i$. Standard errors are clustered at the bank (lender) level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, German credit register (BAKIS-M), and balance-sheet statistics (BISTA).

Table 15: Interbank Lending by Banks with Different Exposure to QE and Negative Rates—Euro Area vs. Rest of World

	Dependent Variable: Lending						
	(1)	(2)	(3)	(4)	(5)	(6)	
QE × Security Ratio × Deposit Ratio	5.387*	2.910	-0.145	0.0800	-0.140	0.102	
	(2.423)	(2.246)	(0.124)	(0.197)	(0.123)	(0.196)	
Large Bank \times QE \times Security Ratio \times Deposit Ratio					4.390* (2.258)	2.698 (1.978)	
R-squared	0.882	0.879	0.893	0.884	0.892	0.884	
N	25508	15286	419618	104552	449130	121014	
Bank (lender) × Bank (borrower) FE	\checkmark	✓	✓	✓	\checkmark	\checkmark	
Bank (borrower) × Time FE	\checkmark	✓	✓	✓	\checkmark	\checkmark	
Sample	large banks	large banks	small banks	small banks	full	full	
Scope	EA	non-EA	EA	non-EA	EA	non-EA	

Notes: The level of observation is credit to bank (borrower) j by bank (lender) i (reporting requirement in the German credit register) in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. The dependent variable is the natural logarithm of the euro amount outstanding between bank (borrower) j and bank (lender) i in quarter q. QE_q is the amount of German government bonds purchased by the ECB in quarter q divided by all banks' total German sovereign bond holdings in 2012. Security $Ratio_i$ is the share of securities over assets a bank (lender) held in 2012. Deposit $Ratio_i$ is the share of deposits over assets of a bank (lender) in 2012. A bank (lender) is considered to be a $Large\ Bank_i$ when total assets exceed 50bn euros in 2012. Otherwise, the bank is a $Small\ Bank_i$. In columns (1), (3) and (5) only lending to banks (borrower) within the euro area (EA) is considered, whereas in columns (2), (4) and (6) only lending to banks (borrower) outside the euro area (non-EA) is considered. Standard errors are clustered at the bank (lender) level. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, German credit register (BAKIS-M), and balance-sheet statistics (BISTA).

Table 16: Cross-border Banking Flows

	Dependent Variable: Bilateral Cross-Border Bank Lending							
	(1)	(2)	(3)	(4)	(5)	(6)		
$\overline{\text{QE} \times \text{Core} \times \text{GIIPS}}$	2.566***			1.836***				
	(0.421)			(0.035)				
$QE \times Core \times High Yield$		2.838*			3.654***			
-		(1.413)			(1.299)			
$QE \times Core \times Low Index$			2.617			2.010		
			(1.800)			(1.732)		
R-squared	0.0535	0.0535	0.0535	0.127	0.127	0.127		
N	65533	65533	65533	65441	65441	65441		
Lender \times Borrower FE	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark		
$\texttt{Lender} \times \texttt{Month FE}$	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark		
Borrower \times Month FE	-	-	-	\checkmark	\checkmark	√		

Notes: The level of observation is the bilateral banking flow from country c to country j in quarter q. The dependent variable is the percentage change in bank claims of country c to country j. The sample period is 2014 to 2020. $QE_{c,q}$ is the amount of country c government bonds purchased by the ECB in quarter q divided by all banks' total security holdings of country c in 2012. $Core_i$ is a dummy if the lending country c is "Germany," "Finland," "Netherlands," or "Austria." $GIIPS_j$ is a dummy if the Borrowing country c is "Greece," "Italy," "Ireland," "Spain," or "Portugal." $High\ Yield_j$ is a dummy if the borrowing country has a high (above median) sovereign yield in 2014. $Low\ Index_j$ is a dummy for a low (below median) Bittner, Bonfim, Heider, Saidi, Schepens, and Soares (2020) index of exposure to negative interest rates. Standard errors are double clustered at the lender and borrower country.

ONLINE APPENDIX—NOT FOR PUBLICATION

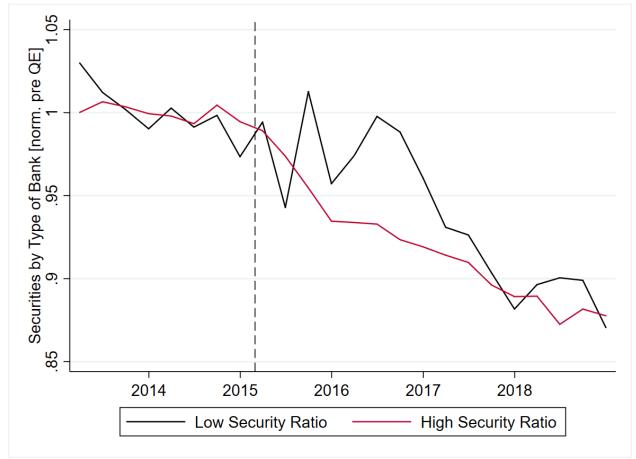


Figure A1: Security Holdings in Germany Before and After QE

Notes: This graph shows the development of security holdings by banks with high and low security ratios (measured by median as of 2012) between 2013 and 2019. Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, Security Holdings Statistics (SHS), and balance-sheet statistics (BISTA).

Table A1: Baseline Table without Triple Interaction

	Dependent Variable: Lending								
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	
QE × Security Ratio	-0.0183	-0.135	-0.132	-0.0587	-0.0543	-0.0173	-0.0201	-0.0666	
	(0.057)	(0.089)	(0.093)	(0.090)	(0.082)	(0.085)	(0.082)	(0.223)	
QE × Deposit Ratio	-0.0138	0.0258	0.0243	0.0372	0.0310	0.0154	0.0171	0.0685	
	(0.019)	(0.023)	(0.023)	(0.026)	(0.030)	(0.026)	(0.027)	(0.080)	
R-squared	0.975	0.976	0.976	0.975	0.975	0.976	0.976	0.976	
N	6382	6311	6311	5913	5863	6311	6311	6311	
Bank FE	✓	\checkmark	\checkmark	\checkmark	✓	\checkmark	\checkmark	✓	
$Borrower \times Month \ FE$	✓	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark	
Country \times Month FE	_	\checkmark	\checkmark	\checkmark	✓	\checkmark	\checkmark	✓	
Specification	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),2012}}$	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),2012}}$	$\frac{App_{c(i),m(t)}}{BSecH_{c(i),m(t)-1}}$	$ln(App_{c(i),m(t)})$	$ln(App_{m(t)})$	$ln(H_{c(i),m})$	$ln(H_{m(t)})$	QEDummy	

Notes: The level of observation is credit to firm j by bank i in country c on day t. The sample period is 2014 to 2020. The dependent variable is the natural logarithm of the euro amount of debt issued between firm j and bank i on day t. QE measures the implementation of the public sector purchase programme (PSPP) of the ECB. In columns (1)-(2), $QE_{c,m(t)}$ is the log of the purchased amount of the bonds of country c in month-year m(t) divided by all banks' total security holdings of country c in 2012. In column (3), $QE_{c,m(t)}$ has the same numerator, but is now scaled by the banks' total security holdings of country c in the previous month-year. In column (4), $QE_{m(t)}$ is the log amount of government bonds of country c purchased by the ECB in month-year m(t). In column (5), $QE_{m(t)}$ is the log amount of all government bonds purchased by the ECB in month-year m(t). In column (6), $QE_{c,m(t)}$ is the log of the amount of country c government bonds held by the ECB in month-year m(t). In column (7), $QE_{m(t)}$ is the log of the amount of all government bonds held by the ECB in month-year m(t). In column (8), $QE_{m(t)}$ is a dummy equal to one after March 2015. Security Ratio_i is the share of securities over assets a bank held in 2012. Deposit Ratio_i is the share of deposits over assets of a bank in 2012. Standard errors are clustered at the bank level.

Table A2: Descriptive Statistics: German Credit Registry

	mean	sd	p25	p75	count
Lending	6.809	2.061	5.948	8.017	4409608
Security Ratio	0.162	0.105	0.073	0.214	4409608
Deposit Ratio	0.406	0.206	0.175	0.569	4409608
Deposit Ratio HH	0.326	0.198	0.093	0.483	4409608
Deposit Ratio NFC	0.080	0.046	0.056	0.089	4409608
QE	0.039	0.971	-0.844	0.501	4409608
Δ log securities (one year)	0.003	0.244	-0.102	0.078	4355468
Δ log securities (one quarter)	0.002	0.119	-0.037	0.030	4356233

Notes: The level of observation is credit to firm j by bank i (reporting requirement in the German credit register) in quarter q. The sample period spans from the first time negative interest rates are introduced (2014q3) to 2018q4. Lending_{i,j,q} is the natural logarithm of the euro amount outstanding between firm j and bank i in quarter q. QE_q is the amount of German government bonds purchased by the ECB in quarter q divided by all banks' total German sovereign bond holdings in 2012 (standardized). Security $Ratio_i$ is the share of securities over assets a bank held in 2012. $\Delta \log securities_{i,q}$ (one year) is the change in log security holdings of bank i from q to q minus one year, accordingly for $\Delta \log securities_{i,q}$ (one quarter). Deposit $Ratio_i$ is the share of deposits over assets of a bank in 2012. This term is split up into household deposits (Deposit $Ratio\ HH_i$) and deposits from non-financial corporates (Deposit $Ratio\ NFC_i$). Source: Research Data and Service Centre (RDSC) of the Deutsche Bundesbank, German credit register (BAKIS-M), Security Holdings Statistics (SHS), and balance-sheet statistics (BISTA).