

Commercial property prices and bank performance

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Abstract: We seek to assess the effect of changes in commercial property prices on bank behaviour and performance in a range of industrialised economies, extending the existing micro literature on bank performance. The results suggest that, consistent with macro-level studies, commercial property prices have a marked impact on the behaviour and performance of individual banks. The signs found are consistent with a view that commercial property provides important forms of collateral that are perceived by banks to reduce risk and encourage lending. Such an impact exists even when conventional independent variables determining bank performance are included. Moreover, there is evidence that the magnitude of this impact is related to the size of the bank, the direction of commercial property price movements, and regional factors. The results have implications for risk managers, regulators and monetary policy makers. Notably, they underline the crucial relevance of commercial property prices as a macroprudential variable that warrants close scrutiny by the authorities. They also highlight the need to develop indicators of individual bank exposure to the property market that could help to calibrate the potential impact of changes in prices in stress tests.

Keywords: commercial property prices, bank performance, panel estimation

JEL classification: G12, G21

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I. Introduction

It is well-known that bank lending and bank performance have been strongly affected on frequent occasions by asset price fluctuations, at times culminating in banking crises. Among various key assets, commercial real estate is of special interest, not only because commercial property loans are an important component of bank assets, but also because of the widespread use of commercial property as collateral of other types of loans. Whereas there is a fairly extensive literature on the relation between bank lending and commercial property prices at a macro level (see recent work and a literature survey in a companion paper by Davis and Zhu (2004)), there is much less extant work on the impact of commercial property prices on the lending decisions, risk and profitability of individual banks. Evidence of a clear and consistent link to bank performance would underline the importance of commercial property prices as a key macroprudential indicator², as well as being relevant to the monetary transmission process.

This paper seeks to fill the gap by undertaking an extensive analysis of a sample of 904 banks worldwide over the period 1989-2002. We seek to assess the effect of changes in commercial property prices on bank behaviour and performance in 15 industrialised economies, extending the existing micro literature in this area. The results suggest that, consistent with macro-level studies, commercial property prices have a marked impact on the behaviour and performance of individual banks. Such an impact exists even when conventional independent variables determining bank performance are included. Moreover, there is evidence that the magnitude of this impact is related to the size of the bank, the direction of commercial property price movements, and regional factors. The results have implications for risk managers, regulators and monetary policy makers.

To motivate the analysis, Table 1 indicates major differences in bank behaviour and performance during the up- and downswings in commercial property prices in 13 major OECD countries. During an upswing of commercial property price movements, the default risk of bank loans tends to be much lower, and bank profitability rises above its average. Banks are therefore encouraged to extend extra loans to the business sector. The reverse effects are observed when commercial property prices fall.

We organise the remainder of this paper as follows. Section II reviews the existing literature and highlights the contributions of our study. Section III introduces the framework for the empirical analysis, listing all independent variables and their possible impact on bank behaviour and

2 See Davis (1999). In addition, in the recent draft Compilation Guide on Financial Soundness Indicators (Guide) issued by the IMF, real estate prices and bank exposure to the real estate sector were included in the encouraged sets of financial soundness indicators (FSIs).

performance. Section IV describes the data, followed by empirical results in Section V. Section VI concludes.

II. Literature review

Our work draws on two distinct areas of the literature, which relate respectively to the relationship between bank lending and commercial property prices and to bank performance per se. The former has to date been exclusively based on macro data, while the latter mainly uses micro data. Our contribution is to apply concepts in the bank-performance literature to micro data in a conventional manner, before estimating in the light of the credit-property price literature whether commercial property prices impact on bank performance over and above standard variables. Accordingly, we review briefly both areas of the existing literature.

II.1 The impact of commercial property price cycles on banks: a macro perspective

There are strong linkages between commercial property cycles and credit cycles. In the finance literature, this interaction has been extensively explored in the “financial accelerator” framework proposed by Bernanke et al (1994) and Kiyotaki and Moore (1997). In their models, there exist credit market imperfections because borrowers have informational advantages over lenders regarding the true value of the underlying projects. To avoid the potential adverse selection problem (before the loan is extended) and moral hazard (after lending takes place), the lender will request the borrowers to provide collateral³ assets. The price of bank loans (the risk premium) then largely depends on the value and quality (in terms of liquidity, price volatility etc.) of collateral. This argument applies both to normal industrial and commercial loans and to loans to develop property per se.

The “financial accelerator” framework, together with the fact that commercial property has been widely used as collateral, explains why commercial property cycles tend to have a significant impact on the bank lending behaviour and bank performance. Whenever commercial property prices move up, property-related loans are considered to be less likely to default. Therefore loan loss provisions decline and loan quality improves. Meanwhile, banks are willing to extend additional credit to borrowers (particularly in the commercial property sector), and the risk premium tends to be lower. Favourable financing conditions may in some circumstances drive up property prices even further, as investment demand for properties increases while supply is slow to respond, generating a self-reinforcing

3 There are in practice some ambiguities whether collateral reduces risk in the way bankers appear to believe (Salas and Saurina 2002). On the one hand, low risk borrowers may pledge collateral to signal, and collateral reduces moral hazard. On the other hand, pledging collateral may lead banks to neglect screening and monitoring, and better collateral may make banks overoptimistic. Berger and Udell (1990) find collateral is related to higher credit risk.

mechanism between the commercial property cycle and the credit cycle (see the model in a companion paper by Davis and Zhu 2004). A further channel may arise via effects of commercial property prices on banks' fixed assets, which may boost capitalisation.

Furthermore, changes in commercial property prices also affect the banking sector via indirect channels, for example, through their impact on the macroeconomy. When commercial property prices increase above their fundamental values, constructors and developers will start new construction. The new construction activity generates new demand for other sectors. This can cause expansion in the general economy and stimulate the demand for bank credit.

Most empirical work in this area links to residential property prices, for example country-specific studies which reveal strong evidence of dynamic interactions between house prices and bank lending in Hong Kong (Gerlach and Peng 2002), the Netherlands (de Greef et al 2000 and Rouwendal 2002) and the US (Quigley 1999). There are also a few studies based on asset prices that include a mix of residential and commercial property prices (generally with a much higher weight on residential property). Work by Goodhart (1995) explains credit conditions with asset prices, while Borio et al (1994) explain asset prices with credit conditions (debt/GDP ratio), and both find significant results. Hofmann (2001) includes a mixture of residential and commercial property prices in a vector-error correction model and again finds a strong dynamic interdependence between bank credit and property prices with the latter being the causal element.

The linkage of commercial property prices per se to bank lending at a macro level has been less frequently explored in the empirical literature; one exception is Davis and Zhu (2004) who developed a reduced-form theoretical model drawing on the insights of the financial accelerator as well as specific features of the property market. Their model suggests that bank lending is closely related to commercial property prices and that commercial property markets can develop cycles given plausible assumptions, where the cycles are largely driven by the dynamic linkage between the commercial property sector, bank credit and the macroeconomy. Cross-country empirical analysis based on a sample of 17 developed economies confirmed the model's predictions. An investigation of determinants of commercial property prices shows particularly strong links of credit to commercial property in the countries that have experienced banking crises linked to property losses in 1985-95. Further studies of dynamic interaction suggested, as in Hofmann (2001), that property prices are rather "autonomous", in that they tend to cause credit expansion rather than excessive bank lending boosting property prices. In addition, GDP had an important influence on both property prices and bank credit.

While theory and evidence predicts that higher commercial property prices drive up bank credit, their impact on banks' profitability is less obvious. In the short run, increases in commercial property prices reduce the default probability of real estate loans and collateralised loans. The decline in non-performing loans and loan loss provisions improve the banks' profitability. Higher volumes of loans

(and related fees) may compound this effect, offsetting the lower margins. In the long run, however, the existence of such an impact and its direction are less clear. In an efficient world, bank loan rates reflect the true default risk for the underlying assets, and bank profitability should solely depend on the risk appetite of the banks. The more risk the banks take, the higher the expected return. That is, the movements of commercial property prices should have already been incorporated in the pricing of bank loans and will not bring additional profits / losses to the banks.

This independence no longer holds when a bank's risk attitude changes over the cycle, or when a bank has distorted incentives for making loan decisions. A typical example is that, during a commercial property boom, banks may underestimate the default risk of property-related loans (Herring and Wachter 1999, 2002). Banks may also disregard the danger of adverse selection as they seek to expand lending at a rapid pace. This tendency towards "disaster myopia" can be attributable inter alia to inadequate data, poor risk management, pervasive incentives linked to the safety net, or intensified competition following the liberalisation of the banking sector or institutional memory loss over time (Berger and Udell (2003)). If default risk is not priced appropriately, the banking sector may initially appear to be highly profitable but will ultimately be penalised since risk premia fail to compensate potential losses. Another model in which bubbles and crises can arise in a rational world is developed by Allen and Gale (2000). They propose that important driving forces behind the upturn in the lending and property cycles include the risk-shifting behaviour by banks (related to agency problems) and their expectations of continued credit growth, which may in turn be influenced by its volatility.

II.2 Micro-based studies of bank performance

There is an extensive literature on bank performance so we do not attempt to cover it in full. Instead, we shall focus on results of typical studies, generally of international data, which cover the areas we intend to investigate further, notably bank loan loss provisions, bank margins and profitability, bank bad debts and bank lending. Our main objective is to ensure that we utilise in our empirical work those non-commercial property price variables that are in line with the existing literature, and hence assure that positive results for commercial property prices are not reflecting omitted variables bias. We also seek to explore any insights likely to be relevant to commercial property prices (e.g. suggesting they are an omitted variable in existing studies).

In terms of *provisioning*, and typical of the tradition in which our own work is based, previous work includes papers by Cavallo and Majnoni (2001), Laeven and Majnoni (2003) and Bikker and Metzmakers (2004), all of whom analyse datasets similar to ours using Bankscope but with slight

differences in sample coverage.⁴ A common focus of the three papers is the relationship between banks' provisioning for loan losses and banks' pre-provision income, after controlling for bank-specific variables and country-specific macroeconomic and institutional features. They all find a positive link from banks' profitability to provisioning, as is desirable to "provision for bad loans in good times".⁵ At the same time, provisioning decisions are also associated with economic growth, banks' lending behaviour and banks' capital strength. Real GDP growth has a significantly negative effect (Laeven and Majnoni (2003) and Bikker and Metzmakers (2004)), implying there is a deterioration of bank loan quality during economic downturns. Banks with higher loan to asset ratios tend to be involved in higher credit risk and therefore their loan loss provisions are higher (see Cavallo and Majnoni (2001)). The effect of real loan growth rate is mixed. Cavallo and Majnoni and Laeven and Majnoni find a significantly negative effect, which supports the hypothesis that lending booms are associated with imprudent lending practice. By contrast, Bikker and Metzmakers find a positive effect of loan growth on provisioning, which seems to be consistent with the view of Borio et al (2001) and Lowe (2002) that credit risk is built up during a boom, but contrary to these authors, Bikker and Metzmakers suggest banks are conscious of risk and prudently provision. Bikker and Metzmakers also find that provisions rise when the capital ratio is low, suggesting that banks with lower capital ratios may create extra provisions to keep their capital ratios adequate (the so-called capital management hypothesis proposed by Kim and Kross (1998)).

In terms of *bank profitability and margins* a key international study is Demirgüç-Kunt and Huizinga (1999) who estimate bank profitability and interest margins on average over 1988-95 in 80 countries, again using Bankscope. They note that the interest margin measures profitability plus operating costs, plus loan loss provisioning and less non-interest income. Hence this net margin concept (also used in our work) differs from the simple difference between loan and deposit rates (the spread) since it allows for possible loan defaults reducing interest receipts, and related provisioning. They find that higher net interest margins and higher profitability are often associated with stronger bank capital base, higher inflation, higher real interest rates and lower reserve requirements. Moreover, the existence of an explicit deposit insurance scheme and difference in legal and institutional frameworks also has significant impact. In later work on a similar data set (1990-97 in 45 countries), they further point out that profits and margins are affected negatively by the level of financial development, implying that the banking sector is more competitive in advanced countries (Demirgüç-Kunt and Huizinga (2000)).

4 Cavallo and Majnoni (2001) use a sample of 1176 banks from 36 countries over the period 1988-99, and Laeven and Majnoni (2003) include 45 countries with a total of 1419 banks over the same period. By comparison, the study of Bikker and Metzmakers (2004) covers 29 countries over the period 1991-2001.

5 The linkage between earnings and provisioning does not always hold. Cavallo and Majnoni (2001) observe a negative impact of earnings on provisioning in non G-10 countries. Laeven and Majnoni (2003) confirm the negative association

As regards *bad loan ratios* Salas and Saurina (2002) model the problem loans of Spanish banks, with a main focus being to capture the lag between credit expansion and the appearance of problem loans. There is then an interest in finding whether savings banks and commercial banks behave differently given the control variables, which should in turn reflect the different incentives in the ownership structure and related corporate governance aspects. The authors examine the determinants of problem loans taking into account macro controls, the level of indebtedness in the non-financial sector and numerous bank-specific variables⁶, as is feasible in a study of a national market. They note that a recession leads to lower income to repay loans by borrowers, as well as a tightening of credit by banks, both of which increase default risk. The effect of recessions is aggravated by high indebtedness. Nevertheless, individual bank level variables also have a high explanatory power for credit risk even after controlling for macroeconomic conditions, especially for savings banks. In particular, growth policies (as shown by credit expansion and market penetration) and managerial incentives (linked to “gamble for resurrection”) determine future loan losses.

In terms of *lending per se*, Bikker and Hu (2002) seek to distinguish between supply and demand factors in order to assess whether the banking system itself has a procyclical pattern of behaviour. In particular, in line with the so-called bank lending channel of monetary transmission, they were seeking to investigate whether a separate supply-channel can be distinguished based for example on constraints on bank capital. This follows the extensive literature on the US credit crunch of the early 1990s which was thought to be partly linked to such supply constraints (Peek and Rosengren (1995), Bernanke and Lown (1991)). Data used, unlike the other studies cited, were the OECD banking sector data at a macro level. Demand side factors included were macro variables such as GDP, unemployment, inflation, share prices and real M3. Supply side factors were the interest differential, non-bank deposits, capital and reserves and bank profits (current and lagged). Demand side factors were dominant. On the supply side, whereas capital was not significant, profit margins were significant and indicate a role for the bank lending channel.

for Asian banks, and also show a strongly significant effect of a negative earnings dummy, showing that banks make provisions heavily by reducing capital when they make losses, “too much too late”.

- 6 Whereas many of these variables cannot be obtained with the less detailed information from Bankscope, they do highlight important aspects of problem loan generation, in particular that such loans are a consequence of strategic decisions driven by banks’ past performance. They also provide interesting justifications for the use of the variables they choose. These are: (1) loan growth per se (noting that market share competition leads to quality reductions in the balance sheet); (2) branch growth (again to underline risk of adverse selection in bank expansion strategies); (3) a proxy for inefficiency, ratio of operating expenses to operating margin (with a view that inefficient banks skimp on monitoring and screening); (4) percent of loans without collateral (highlighting that its link to risk is ambiguous); (5) size of the bank (with a prior view that larger banks would have lower problem loans due to better diversification – although this could be offset if there are agency problems between managers and shareholders); (6) lagged net interest margins (to assess whether banks with high problem loans take a deliberately riskier credit policy); (7) lagged capital ratios (to proxy whether the bank was “gambling for resurrection”), and (8) market share (whereby banks with monopoly power may take more credit risk because they can be sure of charging higher margins in future).

The previous studies highlight important aspects of determinants of banks' lending behaviour, profitability and problem loan generation. However, there is no role in these studies for property price fluctuations to affect bank performance. To the best of our knowledge, the few exceptional studies on this issue are Arpa et al (2001), Gan (2004) and Gerlach et al (2003). Arpa et al (2001) looks into performance of Austrian banks in the 1990s. After controlling for macro factors, monetary and financial conditions and bank-specific variables, they find that an increase in real estate prices generates high profitability for banks. But surprisingly, they also find that loan loss provisions rise when real estate prices rise. Gan (2004) uses a special matched firm-bank data in Japan and examines the collateral-damage effect related to the decline in property prices on bank credit allocation. She finds that banks tend to lend less to those who suffer greater collateral losses. Gerlach et al (2003) in Hong Kong use a confidential supervisory bank-level data in their panel data study. They note that bank performance is affected by macroeconomic developments, with smaller banks being relatively more exposed to changes in economic conditions that large ones are, consistent with lower diversification. The bursting of the property "bubble" after the East Asia crisis also put banks under stress, but surprisingly, the impact was smaller for those banks with high exposure to the real estate sector, suggesting that property-related loans may remain relatively safe assets compared with other types of bank lending.

In this paper we extend the existing literature in several ways. This is the first international study of how commercial property price movements affect individual banks' lending strategies and performance. Our assessment based on bank-level data suggest that commercial property prices have a marked impact on banks, even after we control for the effects of conventional explanatory variables, including macro factors, bank-specific variables and country-specific factors. Second, the micro-level data allow us to examine whether the determination of bank performance and the role of commercial property prices vary across different groups of banks and across countries. Finally, we also examine the interesting issue on whether commercial real estate booms and busts tend to have asymmetric impacts on bank performance.

III. Empirical framework

In the light of the literature survey above, we now go on to use micro data to examine the connection between commercial property prices and bank performance. We are mainly interested in two questions. First, how do commercial property price movement affect banks' lending decisions, such as the amount of lending and its pricing (as shown by the margin)? Second, how do commercial property price movements affect the bank's performance, including loan quality and profitability? Below we explain briefly the empirical framework to be adopted.

Since our focus is on the behaviour of individual banks, it is natural to use the panel approach. For most of the estimation we undertake standard GLS panel estimation with random effects. For some

dynamic estimation we use the Generalised Method of Moments estimator (Arellano and Bond (1991)) also as a cross check.

III.1 Banks' lending decisions

Our first objective is to examine the role of commercial property prices in affecting banks' lending decisions in respect of loan volume growth and the pricing of loans as proxied by the net interest margin. Furthermore, we need to include conventional determinants of bank lending so as to ensure our results for commercial property prices are not vulnerable to omitted variables bias. Our model specifications are as follows:

$$Y_{i,t} = f(\text{MACRO}_{i,t}, \text{BANK}_{i,t-1}, \text{DUMMY}, \text{CPP}_i) + \varepsilon_{i,t} \quad (1)$$

In equation (1) Y refers to our dependent variable, namely the percentage real loan growth rate (dLOAN) showing the quantity of loans or net interest margins (NIM), an indicator of the price of loans (albeit an imperfect one, given the role of the deposit rate-interbank spread as well as the loan rate spread, provisions etc). In line with the literature reviewed in Section II.2, there are four sets of explanatory variables:

(1) Macroeconomic variables that reflect the state of the economy. They are the growth rate of real GDP, inflation and nominal short-term interest rates (a proxy for monetary policy stance and the benchmark risk-free rates). These variables may be both current and lagged, given the likely delayed impact on bank lending. Since we are studying advanced countries, we do not consider it necessary to include GDP per capita which is broadly comparable across the countries studied.⁷

(2) Bank-specific variables, which we lag one period to prevent simultaneity – in particular because balance sheet variables are end-year. These are⁸:

- Loan-to-asset ratios and the real loan growth rate (the latter excluded in its own equation), which proxy for the credit risk of bank assets. A higher loan-to-asset ratio implies a smaller investment in lower risk government bonds, therefore higher interest margins should be charged to compensate for the high credit risk. The impact of the loan growth rate is more ambiguous, depending on whether or not higher growth is associated with adverse selection, less strict monitoring and lower quality.

7 Besides, per capita GDP is not significant in explaining bank behaviour and performance, even when emerging market economies are included in the sample. See Demirgüç-Kunt and Huizinga (2000) and Cavallo and Majnoni (2001).

8 We do not include overheads/assets and customer funding/assets since they were not significant for Demirgüç-Kunt and Huizinga (2000).

- Capital strength, defined as the unadjusted⁹ equity-to-assets ratio. Typically a strong capital base implies a lower default probability for the bank and therefore its cost of funding is lower (i.e. the interest margin is higher). It also gives the bank more freedom to take advantage of profitable lending opportunities. Nevertheless, too-low capital ratios may induce banks to “gamble for resurrection”, causing opposite impacts on banks lending decisions.
- The net interest margin in the loan growth equation as an indicator of profitability and the credit risk involved in bank assets.
- We also include bank size dummies following the earlier work set out above, notably bearing in mind that small banks may have less interbank business and hence a wider margin for that reason alone.

(3) Country dummies to capture idiosyncratic effects, in particular capturing macro, financial structure, financial development and law/regulation variables, to the extent they do not change markedly over the sample period.

(4) The growth rate of real commercial property prices in the country concerned. Ideally we would like to also include individual banks’ exposure to the commercial real estate sector, such as commercial property loans and property-collateralised loans, but this information is not available. As noted above, we expect that an increase in commercial real estate prices will not only reduce the default probability of property loans, but also improve the quality of other bank assets through the collateral effect (for property-collateralised loans) and through the indirect effect on investments and macroeconomic developments. Therefore, we would expect a positive effect on loan growth and a negative effect on the net interest margin.

III.2 Bank performance

To study the connection between commercial property prices and bank performance, the empirical framework is the same as that cited above. We study the determination of two variables that represent banks’ loan quality, non-performing loan ratios (NPL) and loan loss provisions (PROV), where the former reflects bad debts per se and the second the bank’s response to them in terms of reserving. Independent variables are similar to those for lending per se except an additional variable, earnings before taxes and provisions as a percentage of bank total assets (EBTDA), is included in the provisioning equation. This variable has proved to be very important in explaining banks’ provisioning behaviour in G-10 economies, as noted in Section II.2.

⁹ Although Basel-risk-adjusted asset data were available for some years, use of the risk-adjusted ratio would have entailed a major loss of degrees of freedom.

We also estimate the determination of return on assets (ROA) to represent banks' profitability, while noting that the margin is also related to profitability (albeit omitting the influence of non interest income, overheads and provisions). The numerator is profits before taxes.

The expected impacts of the principal explanatory variables on bank performance, as suggested by previous research and also consistent with their impact on bank lending, are summarised as follows:

- Higher GDP growth rates, or improved macroeconomic conditions, should improve bank performance and reduce the probability of loan default;
- Higher inflation could have a positive effect on bank profits, as default rates are lower due to lower repayment burden in an inflationary environment, as well as leading to a higher “endowment effect” from zero interest demand deposits;
- The impact of interest rates on bank performance is more ambiguous. An increase in short-term interest rates implies a tightening of monetary policy and a rise in cost of funding. However, this effect could be dampened or even reversed, depending how much of the burden could be passed through to customers;
- A higher loan to asset ratio, indicative of a higher credit risk of bank assets, tends to be associated with more problem loans and extra loss provisioning. Its connection with bank profitability is less clear. If the bank's risk attitude remains the same across the credit cycle, its profitability should be higher as a compensation for the higher credit risk. Nevertheless, if the risk-taking behaviour is associated with distorted incentives, such as the “disaster myopia” tendency mentioned above, its linkage with bank profitability is more ambiguous.
- Similarly, the impact of the loan growth rate on bank performance is not clear, depending whether it reflects a shift of the bank's risk attitude or simply the fact that viable investment opportunities are available.
- Capital adequacy has two opposite effects. If the cost-of-funding effect dominates, a higher equity ratio leads to higher bank profitability. If the “gamble for resurrection” effect dominates instead, banks with lower capitalisation will invest more on high-risk assets and the loan quality is impaired.
- The collateral effect suggests that commercial property prices have a negative effect on NPLs and provisioning, and a positive effect on bank profitability.

III.3 Subsamples and cross checks on the results

After running the basic regressions above (with levels of macro variables and dummies, and lags of bank specific variables), we sought to assess whether commercial property price movements have different impacts on different groups of banks. The initiative is in parallel with a recent study by von Kalckreuth and Murphy (2003), who suggested that the impact of financial constraints on corporate firms is stronger for small firms. In the context of the banking industry, changes in property prices might have different impacts because for example large banks and small banks may focus on different lines of business, while their lending strategies as well as access to interbank funds may be different. Therefore, we also include not only size dummies but also interactive terms between, on the one hand, bank size, and on the other hand, commercial property price growth or macroeconomic variables. The model specifications that take in the size effect are:

$$Y_{i,t}=f(\text{BANK}_{i,t-1}, \text{MACRO}_{i,t}, \text{DUMMY}, \text{CPP}_{i,t}, \text{SIZE}_{i,t}, \text{INTERACTIVE}_{i,t}) + \varepsilon_{i,t} \quad (2)$$

We also ran basic equations with a lagged dependent variable to assess robustness. This requires cross checking with the more appropriate Generalised Method of Moments estimation approach (Arellano and Bond (1991)) as also adopted in Salas and Saurina (2002).

We then assessed results with lags to the independent variables, including commercial property itself, to find whether there are different effects at different lags. Notably, we might anticipate that rising property prices, like loan growth, may generate higher profits and lower provisions and bad debts in the short run, but there could be an opposite effect in the longer term when adverse selection becomes apparent and property prices themselves fall.

Furthermore, we examined the issue of whether there exist asymmetric effects of commercial property price movements. We might anticipate that the mechanism through which the financial accelerator affects bank behaviour might be different during property booms and during recessions that follow a collapse of real estate prices. In particular, during a downturn the banks may adjust their lending strategies via either quantity control (credit rationing) or price discrimination (an extremely high risk premium).

Finally, given the scope of the dataset, we are able to estimate separately for the most basic equations the relationships for the US and Canada, European banks and banks in the Far East to assess whether there are regional differences in the relationship of bank behaviour to commercial property prices.

IV. Data

Our empirical work covers 15 industrialised countries and regions, namely Belgium, Canada, Finland, France, Germany, Hong Kong, Italy, Japan, the Netherlands, Norway, Singapore, Sweden,

Switzerland, the United Kingdom and the United States. We collect the data from the following sources:

(1) Macroeconomic variables, including GDP, inflation and interest rates, are retrieved from the macroeconomic database maintained by the Bank for International Settlements (BIS).

(2) Commercial real estate prices are available from a unique database maintained by the BIS. We use annual data. Note that in some countries the commercial property prices only refer to the largest cities rather than the whole country.

(3) Balance sheet and income statement information of individual banks are from the Bankscope database over the period 1989 to 2002. The data were filtered in the following steps, similar to Cavallo and Majnoni (2001):

First, we exclude the central bank, government and multilateral institutions but include all other types of bank and bank-like financial institutions.¹⁰

Second, we include only consolidated bank reports over the sample period, to avoid the double counting problem with subsidiaries. This reduces the size of the sample in European countries, which often have only unconsolidated data in Bankscope.

Third, since the current Bankscope dataset only includes bank reports in the most recent 8 years (1995-2002), we have combined them with a historical dataset that covers the period 1989-1996 in order to get a longer time series and include periods when commercial property prices were more turbulent. Due to discrepancies between the two datasets, we chose to restrict our analysis to data in the current database for those banks where there are discrepancies of over 10% in the level of total assets or total loans in the overlapping years.

Fourth, we have eliminated the banks that have less than four consecutive years of financial statements, in order to control for the quality of bank reports.

Finally, in order to minimize the effects of measurement errors we also remove those bank reports that *fail* one of the following filtering criteria at any particular year:¹¹

- the return on bank assets in absolute terms less than 10%;
- a growth rate of bank assets (in nominal term) smaller than 50% in absolute terms;
- a growth rate of bank loans (in nominal term) smaller than 50% in absolute terms;

¹⁰ They include bank holding companies, commercial banks, cooperative banks, investment banks and securities houses, medium and long-term credit banks, non-bank credit institutions, real estate / mortgage banks and savings banks.

- a ratio of bank loans to bank assets larger than 10% and smaller than 90%;
- a ratio of non-performing loans to total loans smaller than 100%.

The resulting sample includes 904 banks with a total of 6,162 bank/year observations during the sample period (1989-2002). Tables 2 and 3 summarise the distribution of sample banks and the statistics of key variables. The US and Japanese banks dominate our sample set, mainly because we restrict ourselves to consolidated balance sheets only, while as noted most German and French banks typically submit financial reports on an unconsolidated basis.

We have also divided our sample banks into three groups based on their importance in the national market. Two dummy variables, *LARGE* and *SMALL*, are used to label those banks whose market shares (as a percentage of the national aggregate levels of bank assets) during the sample period are above 5% or below 1% respectively. In aggregate, 64 banks are classified into the category of “large” banks and 768 into “small” ones, with 76 being mid-sized. Obviously, the larger banks are more likely to view themselves as “too big to fail”, with an impact on moral hazard and risk taking. Table 4 summarises the characteristics of each group of banks. Overall, small banks have better performance; they charge higher interest margins; their loan quality is better and their profitability is higher as measured by the return on assets. However, the latter may link partly to the lesser portfolio share of low-yielding interbank and other wholesale assets in the balance sheet.

V. Empirical results

V.1 Baseline results

Table 5 summarises the pooled estimates of equation set (1) using FGLS regression. Since the Hausman test always indicated a preference for random over fixed effects, we have displayed random effects results only. As noted, all the equations include country dummies, which capture structural differences in banking and financial systems as well as economic performance. Our key findings include:

(1) Impacts of macro variables

The impact of economic growth is consistent with the existing literature; higher economic growth encourages banks to lend more and permits them to charge higher margins (because the marginal rate

11 The filtering criteria typically correspond to the sample distribution at 95-99 percentiles for each variable. At the same time, we acknowledge the possibility that the filtering scheme may also remove troubled or failed banks because their assets (or loans or profitability) could fluctuate substantially.

of return is higher). It also improves the quality of bank assets (NPL and provisions are lower) and the profitability of the banking sector increases.

The impact of inflation is also consistent with economic intuition. Higher inflation drives down the present value of future repayments (if the interest rate does not adjust perfectly) and hence the default probability of bank loans is lower and the return on assets is higher. For profitability and margins there is also a benefit from the “endowment effect” of zero interest deposits.

Higher nominal interest rates increase the cost of funds, hurting the borrowers’ financial condition. As a result, bank loans are more likely to default. The profitability of banks also decreases, not only because of the tightened financial conditions but also due to deterioration in loan quality (higher NPLs). At the same time, margins widen with high interest rates, suggesting that deposit rates are usually less responsive to policy rates than lending rates. However, the pass-through is evidently not enough to generate profits for banks because of borrowers’ higher default rates.

On the other hand, the result that interest rates have a positive effect on loan growth is somewhat counter intuitive. Theory predicts that a tight monetary policy (high interest rates) constrains bank lending. One possible explanation is that the positive relationship between interest rates and loan growth may actually reflect the connection in the reverse direction, i.e. monetary policy tends to be tighter if bank credit grows faster. Also financial liberalisation, which leads to increased loan growth, typically also entails higher interest rates.

(2) Bank specific variables

Generally, the widespread significance of these variables confirms the studies outlined in Section 2, which suggest that bank level variables influence credit policies, risk and profitability separately from macroeconomic trends.

The loan/asset ratio appears to have some positive link to risk in the provisions equation, albeit not for NPLs per se where it is insignificant. A higher loan/asset ratio is associated with a widening of margins, reflecting risk, but a lower return on assets, perhaps reflecting non-interest costs of a high level of loans in the balance sheet (provisions and staff costs). Meanwhile a high loan/asset ratio appears to act as an error correction term for loan growth, with a negative effect of the ratio on next period’s loan growth. This is consistent with banks having a desired loan share in the balance sheet in the long run.

The results also show that, on average, the increase in bank lending seems to be based on the viability of the project rather than perverse incentives. It is notable that higher loan growth tends to be followed by higher banking profitability and improved loan quality. Even though we also observe negative effects for provisions (as also found by Cavallo and Majnoni (2001)) and interest margins, they do not necessarily imply that banks fail to allow adequately for future loan losses when expanding balance

sheets. Instead, they could simply be a manifestation of improved credit environment during a lending boom.

As might be expected, there is a link from the net interest margin to profits next period. Furthermore, a wide net interest margin tends to promote loan growth next period. There is also a significant positive relation between the interest margin and NPLs and provisions. For the former, it may be recalled that the margin incorporates a risk premium (i.e. the bank may be consciously taking on high risk loans), and that the premium may be expected to widen further when NPLs rise (if not offset by defaults on interest per se). For provisions, wide margins indicate sufficient profitability to make provisions as appropriate, as also found for profitability by Cavallo and Majnoni (2001) cited above.

The lagged capital ratio positively influences the margin, the provisions and return on assets, while it is negatively related to NPLs. The contrast between provisions and NPLs is of interest, indicating that banks with high NPLs typically have low capital ratios – or conversely that banks with high capital ratios have better risk assessment and lower incentives to take risks. Meanwhile capital strength is a sound financial basis for making provisions when required. This is in contrast with the “capital management hypothesis” as proposed by Kim and Kross (1998). The results for return on assets and for net interest margins are consistent with the idea that well-run and profitable banks have high capital ratios – a low ratio is a sign of future weakness in terms of profitability. Also, as suggested by Demirgüç-Kunt and Huizinga (2000), well-capitalised banks have lower bankruptcy costs, which reduce the cost of funding and increases profitability and the interest margin. Note that we do not find a significant direct effect of capital on lending over the full dataset.

Our results also confirm the positive effect of earnings on provisioning¹². This could partly be explained by the “income-smoothing hypothesis”, i.e. banks use provisions to compensate for the difference between realised credit losses and average credit losses. This can be fulfilled by taking positive values (higher provisions) during cyclical expansions and negative values (lower provisions) during downturns. However, the positive link could also be explained by the possibility that higher earnings are associated with higher risk.

Moreover, bank size matters. Although there seems to be no difference in loan growth between small, medium and large banks, smaller banks charge wider interest margins, consistent with a lower volume of low-margin wholesale business. In addition, small banks’ vulnerability to insolvency is indicated by the fact that they typically have high NPLs and lower profitability. This is in sharp contrast with our first impression from Table 4, suggesting that the overall lower NPLs and higher profits for smaller

12 As noted, we prefer to lag this variable, in line with the other micro variables. Suffice to note here that the results are similar when the current level of the variable is included in the provisioning equation.

banks are related to other bank-specific factors, and smaller banks usually suffer from weaker credit risk assessment as well as a lower level of diversification.

(3) Impact of commercial property prices

The commercial property price variable is highly significant in all five equations, which indicates that they are crucial omitted variables in existing studies of bank performance. Overall our results give strongly supporting evidence on the financial accelerator mechanism (or the collateral effect).

The impact of increasing real commercial property prices on banks' lending behaviour is consistent with theoretical predictions of the financial accelerator. Higher commercial property prices encourage banks to lend more, and the risk premium shrinks when property prices rise.

Higher commercial property prices also turn out to be positive news in the current period for the quality of bank loans and the profitability of the banking sector, since a rise in CPP leads to a fall in provisions and in non-performing loans. Meanwhile, there is a positive relationship to profitability. This is still consistent with the possibility that risk may emerge at a later date, since commercial property loans rarely default in the upturn.

On the quantitative aspect, changes in commercial property prices explain almost as much as macro variables. In particular, a one-standard-deviation change in CPP growth (10.85%) tends to increase bank growth rate by 1.74% and ROA by 0.1% on average, and reduce the margin by 10 basis points, the NPL ratio by 0.22% and the provisioning ratio by 0.053%.

Indeed, looking at the equations the other way, declining property prices are shown to lead to declining loan growth (which may have macroeconomic consequences) as well as wider interest margins and lower bank profitability, which may entail credit rationing. Equally, we see that falling property prices are strongly significant indicators of rising NPLs and provisions.

V.2 Size effect

An extension of the baseline regression allows for the interaction between bank size and commercial property prices and macro variables. Note that size is defined in terms relative to the national market, which is the aspect relevant to moral hazard, "too big to fail" and the safety net.

Table 6 report the results. The impacts of the size dummies and commercial property prices, as well as macro variables and bank characteristics (not shown in detail) are quite similar with the baseline study (Table 5). Concerning the interactive effect between bank size and macro variable, there is no strong evidence of such an impact between large and medium size banks. However, small banks show different responses to macro changes. First, NPLs of small banks are more geared to the cycle than are those of large and (a fortiori) medium size banks. Second, their provisions are less cyclical, which may

indicate a degree of vulnerability, depending on whether sufficient reserves are constituted in the upturn. Third, interest rate rises boost the margins of small banks more than those of larger ones, as well as entailing higher provisions. In addition, inflation has a weak negative effect on lending of small banks.

The economic impact of commercial property prices is as noted very robust, but its magnitude differs for small banks. In particular, small banks' lending decisions are less dependent on commercial property prices than for mid-size and large banks. One possible reason is that small banks rely more on relationship lending and less on collateralised loans. Such a hypothesis could be supported by another empirical evidence that commercial property price movements have a smaller effect on the loan quality and provisions for small banks than for large ones (a less negative sign is implied for CPP). Furthermore, the profits for small banks are less geared to commercial property prices. This is also consistent with large banks being more willing to take risk as a consequence of the safety net and moral hazard.

V.3 Including lagged dependent variables

To examine the robustness of the above results when more dynamics are allowed for, we now present empirical results if a lagged dependent variable is also included in the regression.

Table 7 shows results of estimation of the models using the FGLS method. The lagged dependent variables are significant throughout and particularly large in the case of the net interest margin, NPLs and the return on assets. At the same time, the results for the independent variables are quite robust, with in particular all the signs and significance of the CPP variables being maintained, with the exception of the interest rate margin where the sign and size is retained but the coefficient becomes insignificant.

We need to be cautious in explaining the results in Table 7, because including a lagged dependent variable causes bias in FGLS estimators when T is finite (Hsiao 1986 pp 88). Arrelano and Bond (1991) propose a GMM difference estimator, which is consistent in this situation. Nevertheless, the number of useful observations is very limited given the short time series in our data. For a satisfactory set of diagnostics, the GMM requires a significant negative first order autocorrelation and no second order autocorrelation; also the instruments must be shown to be appropriate by the significant Sargan test.

We show 2-step GMM estimates with a difference transformation in Table 8, where the instruments are lagged differences of the independent variables, and the second and third lag of the dependent variable. These results show that the CPP effects remain robust except again for the bank interest margin. Hence, property prices are still shown to drive bank profitability and loan growth, positively, and both bad debts and provisions, negatively. There is generally a lower level of significance for the

other independent variables, and some sign-changes also. The much lower number of useful observations is a drawback – as little as 1640 for bad debts. The diagnostics are generally satisfactory, although the Sargan test for appropriate instruments is not always significant, and only in some equations is there the required evidence of first order autocorrelation, although there is a general absence of second order autocorrelation.

V.4 Including lagged macro variables and loan growth

To further examine the robustness of the above results with more dynamics, as well as investigating longer term responses to key macro variables and loan growth, Table 9 shows empirical results if GDP growth, loan growth and commercial property prices are all entered with two year lags as well as (for GDP and CPP) current levels. This is consistent with the approach of earlier work on bad debts by Salas and Saurina (2002) cited above. Again, other independent variables are generally robust in sign and significance.

For GDP growth, signs for loan growth, the net interest margin and provisions are consistent for each of the three years – and all significant also. In particular, we have all positive and significant for loan growth and NIM, and negative and significant for provisions. These indicate that a simpler framework with a lagged dependent variable will capture the dynamic pattern adequately. More intriguing are the effects of GDP on NPLs and on the return on assets. Here we see a sign reversal, with the level and lag having a negative effect on NPLs while the second lag has a positive sign. A similar pattern with opposite signs applies to the return on assets. This may reflect simple cyclical patterns but may also indicate over-expansion of lending in the boom, which leads in two years to adverse effects on NPLs and profits.

Loan growth has consistent signs in all cases except for an insignificant opposite (positive) sign on the second lag for provisioning. This is consistent with high loan growth being risky and hence necessitating provisioning, although it is notable that this result is not present for NPLs. A third lag may have shown a different pattern, but would have lost too many degrees of freedom.

Finally, in terms of commercial property prices, only results for the net interest margin (which contracts when commercial property prices rise) are fully consistent with the benchmark result in Table 5. A richer and more complex pattern is shown for example for loan growth where commercial property prices raise lending on a contemporaneous basis but lower it a year on. This could link to caution by banks as to whether rising prices are sustainable. For non-performing loans, there is a strongly negative pattern in the first and second lag, in contrast to the levels term which is positive. Hence, non-performing loans will continue to accumulate even after property prices start to rise after a decline, perhaps because banks will be more willing to recognise NPLs when they have a prospect of

selling the collateral. Meanwhile, the effect on return on assets is now significant at the second lag rather than contemporaneously, and no significant effect is detectable for provisions.

V.5 Asymmetric effects of property price ups and downs

To investigate whether commercial property booms and busts may have different impacts on bank performance, we added another explanatory variable namely positive commercial property price movements (which equals to zero when property prices fall). Table 10 shows the main results. Again, the magnitude and statistical significance of coefficients on macroeconomic indicators and bank-specific variables almost remain the same as in the baseline study.

There is no clear evidence that commercial property booms and busts have different impacts on bank performance, including the quantity and quality of bank loans and the returns on bank assets.. However, they do affect banks' loan pricing decisions differently. During a downturn of a commercial property cycle, banks seem to rely more on pricing discrimination rather than credit rationing. Particularly, there is a less strongly negative effect on net interest margins during an upturn of commercial property cycles. It is likely that banks tend to charge a very high risk premium when commercial property prices fall in order to compensate for the risk or to discourage loan application. Moreover, there is a similar effect on provisioning which is close to the 10% significance level, implying increases in bad loan provisions are more substantial when commercial property prices fall, which, again, may imply additional concern of banks over risk in downturns.

V.6 Separate estimation for Europe, America and Asia

We broke down the dataset into three geographical subcomponents, largely to investigate whether the commercial property price results are consistent. Here we mainly focus on the different impacts of commercial property prices in those areas, even though other omitted results may be of considerable interest as well.

Overall, American banks (Table 11) and European banks (Table 12) respond to commercial property prices similarly to the full sample. However, American banks' bad debts turn out to be more strongly driven by commercial property cycles, whereas the same effect for European banks is close to zero. Furthermore, for American banks provisioning is positively linked to changes in CPP, i.e. banks raise provisions when commercial property prices rise, in contrast to the balance of the sample as a whole.

Asian banks' results are less well determined than the other groups, with a small number of observations (with a dominance of Japanese banks). In this case many baseline results do not pass (Table 13) – probably reflecting different arrangements and non-conventional economic environment in some Asian financial systems. Property price movements have a much stronger positive effect on loan growth than in other areas, suggesting the importance of the commercial property sector in these

economies. Nevertheless, the effects of commercial property prices on interest margins, profits, provisions and problem loans are no longer significant. Another intriguing result is that lower capital adequacy is associated with higher profitability, loan delinquencies and loan growth, which seems to support the “gambling for resurrection” story that banks with weak capital base tends to pursue for high-risk, high-return projects (as documented by Inaba et al (2003)).

VI. Conclusions

We contend that our results indicate that commercial property prices have a major impact on a wide range of bank performance variables, ranging from risk indicators to profitability and lending activity – an impact omitted from most of the existing literature. The signs found are consistent with a view that commercial property provides an important form of collateral that is perceived by banks to reduce risk and encourage lending. These results hold consistently across a number of econometric specifications, as well as for regions. There are some interesting differences in the response of small and large banks, with in particular commercial property price movements having a smaller effect on the loan quality and provisions for small banks than for large banks. Furthermore, their profits are less geared to commercial property prices than are those of large banks. This is consistent with large banks being more willing to take risk as a consequence of the safety net and moral hazard. Generally, and notably in combination with the macro results in Davis and Zhu (2004), these results underline the crucial relevance of commercial property prices as a macroprudential variable that warrants close scrutiny by the authorities. They also highlight the need to develop indicators of individual bank exposure to the property market that could help to calibrate the potential impact of changes in prices.

<p style="text-align: center;">Table 1</p> <p style="text-align: center;">Bank lending and bank performance at different stages of commercial property cycles</p> <p style="text-align: center;">(1979-2001)</p>										
Country	Growth rate of bank loans (%)		Growth rate of risk-weighted assets (%)		Return on assets (%)		Provisions on loans as a percentage of net income (%)		Memo: number of years	
	Up swing ¹	Down swing	Up swing	Down swing	Up swing	Down swing	Up swing	Down swing	Up swing	Down swing
Belgium	8.69	4.75	7.86	3.42	0.38	0.34	17.13	21.36	14	9
Canada	6.51	8.16	--	--	1.00	1.01	32.33	34.89	9	7
Finland	11.02	-1.73	--	--	0.21	0.32	37.02	27.95	18	5
France	7.42	2.67	--	--	0.44	0.27	30.63	58.25	14	9
Germany	7.33	8.58	--	--	0.54	0.59	39.79	41.44	14	9
Italy	13.02	7.77	9.19	3.29	1.04	0.70	25.73	37.97	8	10
Japan	12.34	-0.18	--	-8.87	0.48	-0.08	6.98	57.02	12	11
Netherlands	13.25	10.20	13.62	5.89	0.69	0.58	18.84	24.69	15	8
Norway	15.00	10.03	9.59	-0.13	0.94	0.02	23.32	145.92	14	9
Sweden	11.39	8.41	5.26	8.26	0.73	0.74	56.10	40.87	16	7
Switzerland	8.58	4.70	3.47	1.17	0.68	0.57	--	--	11	12
UK	10.48	10.45	9.74	14.68	1.02	0.85	--	--	11	12
US	9.64	5.07	9.59	3.62	1.39	1.17	22.59	39.52	9	14
Average	10.36	6.07	8.54	3.48	0.73	0.55	28.22	48.17		
<p>¹ “Up (down) swing” refers to the years when real commercial property prices in that country increase (decrease).</p> <p>Sources: OECD; BIS; authors’ calculations.</p>										

Table 2 Distribution of sample banks			
By country	Number of banks	By specialisation	Number of banks
Belgium	19	Bank holding company	428
Canada	21	Commercial bank	269
Finland	4	Cooperative bank	67
France	58	Investment bank / securities house	36
Germany	40	Median and long term credit bank	12
Hong Kong	13	Non-banking credit institution	26
Italy	38	Real estate / Mortgage bank	37
Japan	143	Savings bank	29
Netherlands	8		
Norway	14		
Singapore	5		
Sweden	5		
Switzerland	28		
United Kingdom	54		
United States	454		
Total	904	Total	904

Table 3

Summary statistics of regression variables

Variables	No. Obs	Mean (%)	Std. Dev. (%)	Min (%)	Max (%)
Asset growth rate	5244	8.13	10.90	-49.17	49.72
Loan growth rate	5132	8.54	12.03	-49.98	49.98
Loan to asset ratio	6025	61.07	15.22	11.27	89.86
Net Interest Margin (NIM)	5980	3.39	2.19	-5.88	36.72
Non-Performing Loan ratio (NPL)	4353	2.44	3.91	0.00	45.79
Return on Assets (ROA)	6056	0.85	0.90	-7.65	8.79
Provisions / Total Assets	5844	0.40	0.65	-2.16	16.36
GDP growth rate	12656	2.44	2.11	-7.85	15.57
Inflation	12656	2.57	1.66	-4.04	10.97
Interest rate	12656	5.22	2.83	0.09	14.76
Growth rate of real commercial property prices	12651	-3.94	10.85	-49.19	35.49

Table 4

Characteristics of banks grouped by sizes¹

Variables	Large banks		Mid-sized banks		Small banks	
	Mean	Std dev	Mean	Std dev	Mean	Std dev
Loan growth rate	5.91	10.36	5.45	11.90	9.12	12.11
Loan to asset ratio	54.79	14.49	62.33	14.93	61.52	15.19
NIM	1.82	0.86	2.13	1.45	3.67	2.23
NPL	4.58	4.06	4.34	6.23	2.15	3.58
ROA	0.37	0.58	0.44	0.81	0.94	0.91

¹ There are 62 large banks, 76 mid-sized banks and 766 small banks.

Table 5
Pooled regression with random effects

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	8.8*** (6.1)	1.94*** (7.8)	1.4** (2.4)	0.42*** (3.2)	-0.21** (2.4)
Macro indicators					
GDP growth	0.44*** (5.2)	0.05*** (10.6)	-0.046** (2.2)	0.026*** (3.7)	-0.013*** (2.8)
Inflation	-0.18 (0.9)	0.007 (0.6)	-0.58*** (10.2)	0.14*** (8.6)	-0.048*** (4.4)
Interest rate	0.42*** (4.0)	0.07*** (11.0)	0.12*** (4.4)	-0.053*** (5.8)	0.007 (1.2)
Bank indicators					
Loan/Asset (-1)	-0.083*** (5.6)	0.01*** (6.3)	-0.0023 (0.4)	-0.0057*** (4.1)	0.0037*** (4.1)
Loan growth rate (-1)		-0.0028*** (3.3)	-0.022*** (6.6)	0.0053*** (4.6)	-0.0043*** (5.6)
NIM (-1)	0.47*** (3.6)		0.14** (2.5)	0.27*** (23.4)	0.007* (8.7)
Capital ratio (-1)	0.084 (1.3)	0.053*** (8.5)	-0.114*** (5.2)	0.052*** (8.9)	0.0066* (1.6)
EBTDA/Total assets (-1)					0.06*** (5.6)
SMALL	Insig	0.74*** (3.5)	1.0** (2.5)	-0.25*** (3.2)	-0.11** (2.3)
LARGE	Insig	Insig	Insig	Insig	Insig
Commercial property sector D(CPP)					
	0.16*** (9.4)	-0.0095*** (8.8)	-0.02*** (4.0)	0.0095*** (6.1)	-0.0049*** (4.8)
<i>No. Obs.</i>	5052	4195	3069	4182	4060
<i>Adj. R²</i>	0.12	0.31	0.49	0.5	0.3

Note: The definitions of explanatory variables are as follows. The three macroeconomic indicators are the annual growth rate of real GDP, inflation rate and the nominal short-term interest rate. Bank-specific variables are the ratio of bank loans to total bank assets, the growth rate of real bank loans, the net interest margin, the ratio of equity capital to total bank assets, and earnings before taxes and provisions as a percentage of total bank assets (only entered in the provisions equation). The two dummy variables LARGE and SMALL refer to those banks whose market share (as a percentage of the national level) in term of bank assets is above 5% and below 1%, respectively D(CPP) is the annual growth rate of real commercial property prices in the home country. All the variables except the two dummies are defined in percentages.

t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies (not shown in detail).

Table 6

Pooled regression with random effects and leveraged size effects

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
SMALL	Insig	0.42* (1.9)	1.1** (2.3)	-0.23** (2.0)	-0.29** (2.3)
LARGE	Insig	Insig	Insig	Insig	Insig
GDP*SMALL	Insig	Insig	-0.24*** (4.1)	Insig	0.022* (1.6)
GDP*LARGE	Insig	Insig	-0.16* (1.9)	Insig	Insig
IR*SMALL	Insig	0.08** (3.8)	Insig	Insig	0.043** (2.3)
IR*LARGE	Insig	Insig	Insig	Insig	Insig
INF*SMALL	-0.94* (1.6)	Insig	Insig	Insig	Insig
INF*LARGE	Insig	Insig	Insig	Insig	Insig
D(CPP)	0.26*** (5.1)	-0.01*** (3.1)	-0.053*** (3.4)	0.019*** (4.0)	-0.0168*** (5.6)
D(CPP)*SMALL	-0.11** (2.2)	Insig	0.04** (2.3)	-0.011** (2.2)	0.014*** (4.4)
D(CPP)*LARGE	Insig	0.0082* (1.8)	Insig	Insig	Insig
<i>No. Obs.</i>	5052	4195	3069	4182	4060
<i>Adj. R²</i>	0.12	0.31	0.49	0.50	0.3

Note: See Table 5. t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies and other independent variables (not reported in detail)

Table 7

Pooled regression with random effects and lagged dependent variables

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	6.6*** (4.5)	0.032 (0.6)	-0.17 (0.6)	0.33*** (3.4)	-0.15** (2.0)
Lagged variable	0.16*** (10.4)	0.93*** (224.0)	0.77*** (77.2)	0.54*** (6.0)	0.32*** (21.2)
Macro indicators					
GDP growth	0.59*** (6.2)	0.021*** (6.1)	-0.076*** (5.0)	0.039*** (6.0)	-0.02*** (4.1)
Inflation	-0.52** (2.4)	0.043*** (5.8)	-0.26*** (6.0)	0.076*** (5.2)	-0.029*** (2.8)
Interest rate	0.31*** (2.6)	-0.016*** (3.9)	0.11*** (5.2)	-0.032*** (3.9)	0.006 (1.1)
Bank indicators					
Loan/Asset (-1)	-0.065*** (4.3)	0.0011** (2.3)	0.008*** (2.9)	-0.0031*** (3.2)	0.002*** (2.8)
Loan growth rate (-1)		-0.0027*** (5.2)	-0.035 (1.5)	0.0005 (0.5)	-0.0017*** (2.3)
NIM (-1)	0.48*** (3.9)		-0.032 (1.1)	0.13*** (14.7)	0.0005*** (6.y)
Capital ratio (-1)	0.013 (0.2)	0.0039* (1.8)	-0.024** (2.1)	0.0084* (1.9)	0.0056* (1.6)
EBTDA/Total assets (-1)					0.057*** (5.1)
SMALL					-0.083** (2.0)
LARGE					0.0047 (0.1)
Commercial property sector					
D(CPP)	0.12*** (5.7)	-0.01 (1.4)	-0.021*** (5.7)	0.0041*** (2.9)	-0.0035*** (3.5)
<i>No. Obs.</i>	4185	4180	2962	4182	4059
<i>Adj. R²</i>	0.17	0.97	0.87	0.66	0.43

Note: See Table 5. t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively.

Table 8

Pooled regression with random effects, difference specification and lagged dependent variables (2 step GMM estimation)

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	-2.2 (0.7)	0.02 (0.4)	0.5* (1.8)	0.03 (0.3)	0.02 (0.7)
D.Lagged variable	0.096*** (2.6)	0.73*** (5.9)	0.73*** (10.0)	0.38** (2.5)	-0.1 (0.6)
Macro indicators					
D.GDP growth	-0.054 (0.3)	0.028*** (2.8)	0.08 (1.4)	0.033* (1.8)	-0.02 (1.4)
D.Inflation	-3.1*** (3.7)	0.11** (2.1)	0.3 (1.0)	0.22*** (3.3)	-0.12*** (2.8)
D.Interest rate	1.6*** (3.3)	-0.052 (1.5)	-0.0008 (0.1)	-0.08** (2.3)	0.037 (1.1)
Bank indicators					
D.Loan/Asset (-1)	-0.71** (2.0)	-0.033** (2.0)	0.1 (1.5)	-0.064** (2.0)	0.012 (0.8)
D.Loan growth rate (-1)		-0.0014 (0.6)	-0.003 (0.4)	0.0014 (1.4)	-0.0031 (1.6)
D.NIM (-1)	-6.9** (2.3)		0.4 (1.4)	0.4 (1.6)	-0.015 (0.1)
D.Capital ratio (-1)	1.7 (0.8)	-0.068 (0.9)	0.1 (0.5)	0.09 (0.7)	-0.2** (2.5)
D.EBTDA/Total assets (-1)					0.092 (1.2)
Commercial property sector					
D.D(CPP)	0.103* (1.8)	0.0007 (0.3)	-0.04** (2.4)	0.013*** (3.1)	-0.0066** (2.1)
<i>No. Obs</i>	3282	2454	1640	2441	2392
<i>Joint Wald</i>	62.4 [0.00]	64.1 [0.00]	168 [0.0]	30.3 [0.0]	44.7 [0.00]
<i>Sargan</i>	24.9 [0.2]	47.5 [0.0]	31.9 [0.03]	28.7[0.07]	109.9 [0.003]
<i>AR(1)</i>	-5.5 [0.0]	-3.3 [0.01]	-2.9 [0.004]	-2.7 [0.006]	-1.96 [0.05]
<i>AR(2)</i>	-0.27 [0.78]	-0.3 [0.8]	0.3 [0.75]	-1.3 [0.2]	-1.05 [0.29]

Note: See Table 5. All variables are differenced (denoted by “D”) compared to the other tables, hence are in first or second difference form. D(CPP) is the annual growth rate of real commercial property prices in the home country; t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies and small/large bank dummies (not reported in detail). The instruments are the first differenced lags of the independent variables and the second and third lags of the dependent variable.

Table 9
Pooled regression with random effects and lagged macro variables

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	6.2*** (3.8)	1.6*** (5.9)	1.2* (1.8)	0.5*** (3.4)	-0.122 (1.2)
Macro indicators					
GDP growth	0.73*** (6.2)	0.046*** (7.1)	-0.13*** (4.4)	0.049*** (5.5)	-0.027*** (4.7)
GDP growth(-1)	0.81*** (5.6)	0.03*** (3.8)	-0.19*** (5.1)	0.04*** (3.6)	-0.024*** (3.4)
GDP growth(-2)	0.42*** (3.0)	0.021*** (2.8)	0.11*** (3.3)	-0.02* (1.9)	-0.038*** (5.6)
Inflation	-0.96*** (3.7)	0.035** (2.2)	-0.58*** (7.6)	0.13*** (6.2)	-0.011 (1.2)
Interest rate	-0.16 (1.0)	0.035*** (3.8)	0.24*** (5.4)	-0.065*** (5.3)	0.0011 (1.5)
Bank indicators					
Loan/Asset (-1)	-0.072*** (4.4)	0.013*** (6.3)	0.00081 (0.1)	-0.0057*** (3.6)	0.0031*** (3.1)
Loan growth rate (-1)	0.16*** (9.5)	-0.0016* (1.7)	-0.026*** (6.8)	0.0063*** (4.8)	-0.004*** (4.9)
Loan growth rate (-2)	0.04*** (2.6)	-0.002** (2.0)	-0.02*** (5.2)	0.0004 (0.3)	0.0006 (0.7)
NIM (-1)	0.41*** (3.1)		0.15** (2.3)	0.28*** (21.3)	0.0081*** (3.1)
Capital ratio (-1)	-0.016 (0.2)	0.081*** (11.1)	-0.11*** (4.3)	0.038*** (5.7)	0.007 (1.5)
EBTDA/Total assets (-1)					0.069*** (5.3)
SMALL	0.19 (0.2)	0.66*** (3.0)	0.93** (2.1)	-0.27*** (3.0)	-0.07 (1.1)
LARGE	1.1 (1.0)	0.28 (0.9)	-0.31 (0.5)	-0.15 (1.3)	0.022 (0.3)
Commercial property sector					
D(CPP)	0.068** (2.4)	-0.0049*** (3.4)	0.013* (1.9)	0.002 (1.0)	-0.0012 (1.0)
D(CPP)(-1)	-0.058** (2.1)	-0.0079*** (5.2)	-0.024*** (3.2)	0.0002 (0.1)	0.0008 (0.6)
D(CPP)(-2)	-0.012 (0.6)	-0.011*** (8.8)	-0.021*** (3.8)	0.081** (2.3)	-0.0008 (0.7)
<i>No. Obs.</i>	3316	3324	2416	3313	32160.34
<i>Adj. R²</i>	0.19	0.33	0.48	0.5	

Note: See Table 5. t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively; regressions also include country dummies (not shown).

Table 10

Pooled regression with asymmetric effects of commercial property price movements

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	10.6*** (6.7)	2.0*** (8.2)	1.52** (2.6)	0.41*** (3.1)	-0.23** (2.6)
Macro indicators					
GDP growth	0.43*** (5.5)	0.052*** (11.6)	-0.042** (2.0)	0.026*** (3.7)	-0.014*** (2.9)
Inflation	-0.16 (0.9)	0.011 (0.9)	-0.60*** (10.2)	0.15*** (8.6)	-0.046*** (4.2)
Interest rate	0.45*** (4.6)	0.068*** (11.9)	0.126*** (4.4)	-0.054*** (5.9)	0.006 (1.0)
Bank indicators					
Loan/Asset (-1)	-0.13*** (7.9)	0.01*** (6.8)	-0.002 (0.5)	-0.0057*** (4.1)	0.0037*** (4.1)
Loan growth rate (-1)		-0.0029*** (3.9)	-0.022*** (6.9)	0.0053*** (4.6)	-0.0043*** (5.6)
NIM (-1)	0.38*** (2.7)		0.145*** (2.6)	0.27*** (23.3)	0.0072*** (8.2)
Capital ratio (-1)	0.20*** (2.9)	0.048*** (8.5)	-0.116*** (5.3)	0.052*** (8.9)	0.0069* (1.7)
EBTDA/Total assets (-1)					0.066*** (5.5)
SMALL	-0.02 (0.02)	0.76*** (3.6)	1.00** (2.5)	-0.25*** (3.2)	-0.12** (2.3)
LARGE	0.87 (0.7)	0.16 (0.5)	-0.434 (0.8)	-0.12 (1.2)	-0.005 (0.1)
Commercial property sector					
D(CPP)	0.14*** (5.1)	-0.014*** (8.2)	-0.01 (1.1)	0.0077*** (2.7)	-0.0075*** (3.9)
D(CPP) *dummy(DCPP)	0.04 (0.86)	0.0096*** (3.4)	-0.02 (1.3)	0.0034 (0.7)	0.0051 (1.6)
<i>No. Obs.</i>	5027	4170	3042	4156	4059
<i>Adj. R²</i>	0.11	0.31	0.49	0.50	0.30

Note: See Table 5. t-statistics in parentheses; * show significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies (not shown in detail).

Table 11

Pooled regression with random effects – American banks

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	7.8*** (2.6)	2.0*** (7.5)	1.6*** (3.5)	0.71*** (3.4)	0.12 (1.3)
Macro indicators					
GDP growth	0.81*** (3.7)	0.08*** (8.6)	-0.085*** (3.0)	0.026* (1.9)	0.005 (0.7)
Inflation	-1.12* (1.8)	0.004 (0.1)	-0.37*** (4.0)	0.044 (1.0)	0.062*** (2.9)
Interest rate	1.4*** (5.0)	0.07*** (5.3)	0.17*** (4.2)	-0.015 (0.8)	-0.048*** (5.3)
Bank indicators					
Loan/Asset (-1)	-0.11*** (4.5)	0.017*** (10.9)	0.0083** (2.3)	-0.0035** (2.0)	0.004*** (5.0)
Loan growth rate (-1)		-0.002** (2.5)	-0.013*** (5.4)	0.0011 (0.4)	-0.0017*** (3.0)
NIM (-1)	0.44 (1.6)		0.0061 (0.1)	0.21*** (9.8)	0.053*** (4.8)
Capital ratio (-1)	0.02 (0.2)	0.044*** (6.9)	0.016 (0.9)	0.055*** (7.5)	-0.0081** (2.1)
EBTDA/Total assets (-1)					Insig
SMALL	-0.46 (0.2)	0.26 (1.1)	-1.2*** (3.8)	-0.33** (2.4)	-0.33*** (4.8)
LARGE	4.4 (1.3)	0.67 (1.5)	-3.3*** (6.0)	0.15 (0.6)	-0.58*** (4.5)
Commercial property sector D(CPP)					
	-0.035 (0.7)	-0.015*** (6.6)	-0.041*** (6.3)	0.0055*** (7.5)	0.0041*** (2.7)
<i>No. Obs.</i>	2697	2238	2227	2237	2213
<i>Adj. R²</i>	0.07	0.27	0.21	0.26	0.24

Note: See Table 5. t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies (not shown in detail).

Table 12

Pooled regression with random effects - European banks

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	2.4 (0.6)	1.5 (1.4)	10.2*** (3.2)	0.012 (0.1)	0.98** (2.6)
Macro indicators					
GDP growth	0.42** (2.1)	0.09*** (7.3)	-0.064 (0.7)	0.03** (2.2)	-0.00027 (0.25)
Inflation	0.12 (0.3)	-0.025 (0.9)	-0.77*** (3.3)	0.13*** (3.8)	-0.056** (2.3)
Interest rate	-0.18 (0.9)	0.14*** (10.1)	0.049 (0.4)	-0.065*** (3.7)	0.067*** (5.3)
Bank indicators					
Loan/Asset (-1)	-0.024 (1.1)	-0.0044 (1.4)	-0.035* (1.7)	-0.0062*** (3.0)	0.003 (1.58)
Loan growth rate (-1)		-0.0032** (2.0)	-0.063*** (4.8)	0.0074*** (3.9)	-0.0054*** (3.8)
NIM (-1)	0.17 (1.0)		0.71*** (2.7)	0.18*** (10.4)	0.062*** (4.9)
Capital ratio (-1)	0.236** (2.4)	0.114*** (9.3)	-0.32*** (3.8)	0.088*** (9.8)	0.37 (0.6)
EBTDA/Total assets (-1)					Insig
SMALL	-0.06 (0.1)	0.58 (1.4)	3.1** (2.4)	-0.16 (1.3)	0.14* (1.7)
LARGE	1.1 (0.7)	0.13 (0.3)	1.6 (1.1)	-0.12 (0.8)	0.12 (1.3)
Commercial property sector D(CPP)					
	0.146*** (5.8)	-0.0064*** (3.9)	0.003 (0.2)	0.006*** (2.9)	-0.0023* (1.6)
<i>No. Obs.</i>	<i>1712</i>	<i>1462</i>	<i>521</i>	<i>1454</i>	<i>1373</i>
<i>Adj. R²</i>	<i>0.05</i>	<i>0.22</i>	<i>0.21</i>	<i>0.47</i>	<i>0.21</i>

Note: See Table 5. t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies (not shown in detail).

Table 13

Pooled regression with random effects - Asian Banks

Dependent variables	Loan growth rate	NIM	NPL	ROA	Provisions/ Total Assets
Constant	25.1*** (5.5)	-1.39 (1.4)	Insig	4.4*** (5.3)	-2.2*** (3.0)
Macro indicators					
GDP growth	-0.28*** (3.0)	-0.013 (1.4)	0.15*** (2.6)	0.012 (0.6)	-0.0026 (0.2)
Inflation	0.44** (2.1)	0.072*** (3.2)	-1.2*** (8.4)	0.063* (1.7)	-0.022 (0.7)
Interest rate	0.35* (1.6)	-0.11*** (4.5)	0.26 (0.8)	0.073* (1.7)	-0.13*** (3.9)
Bank indicators					
Loan/Asset (-1)	-0.28*** (6.5)	0.043*** (5.9)	0.027 (0.8)	-0.02** (2.5)	0.02*** (3.0)
Loan growth rate (-1)		0.017*** (4.5)	-0.013 (0.5)	0.016** (2.2)	-0.01(1.7)
NIM (-1)	1.26*** (5.5)		0.4*** (2.7)	0.72*** (16.9)	-0.0027(0.6)
Capital ratio (-1)	-0.36** (2.6)	0.0455** (2.5)	-0.39*** (4.7)	-0.205*** (8.1)	0.095*** (4.8)
EBTDA/Total assets (-1)					0.13** (2.2)
SMALL	2.85*** (2.9)	0.93*** (2.8)	0.7 (0.8)	-0.31* (1.7)	-0.5*** (3.0)
LARGE	1.1 (0.9)	0.07 (0.1)	-1.4 (1.0)	-0.035 (0.1)	0.077 (0.3)
Commercial property sector D(CPP)					
	0.268*** (5.6)	0.0062 (1.5)	-0.028 (0.3)	0.003 (0.4)	-0.0033 (0.5)
<i>No. Obs.</i>	<i>643</i>	<i>495</i>	<i>321</i>	<i>491</i>	<i>452</i>
<i>Adj. R²</i>	<i>0.3</i>	<i>0.32</i>	<i>0.04</i>	<i>0.56</i>	<i>0.42</i>

Note: See Table 5. t-statistics in parentheses; * shows significance of the test statistic at 90%, ** and *** at 95% and 99% respectively. Equations include country dummies (not shown in detail).

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