

Flight to Quality or to Captivity? Information and Credit Allocation

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Abstract

The views expressed in this Working Paper are those of the author(s) and do not necessarily represent those of the IMF or IMF policy. Working Papers describe research in progress by the author(s) and are published to elicit comments and to further debate.

Superior information exchanged over the course of lending relationships generates bankclient specificities to the extent that such information cannot be communicated credibly to outsiders. Consequently, banks obtain higher profits from more captured borrowers than from borrowers with financing alternatives. We refer to this as a "flight to captivity" effect. Negative shocks, associated with monetary contractions or foreign entry, cause a reallocation of bank credit away from more transparent borrowers and toward more opaque, more captured borrowers. The paper applies these ideas to the analysis of bank behavior in transition economies after financial liberalization and monetary policy contractions.

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I. Introduction

Asymmetric information makes bank credit special. The superior nature of the information exchanged over the course of a lending relationship generates a bank-client specificity, to the extent that such information cannot be communicated credibly to outsiders. This informational specificity is likely to vary across segments of the market and depends on borrowers' relative ability to signal their quality to outside lenders and banks' ability to gather special information about their clients.

A number of recent papers have examined how the character of the information flows between lenders and borrowers influences the way in which banks compete for clients¹ as well as the market structure of the banking industry.² In the present paper, we focus on an aspect largely overlooked in the previous literature. We analyze how informational specificity affects the way banks allocate credit across groups of borrowers.

The analysis of this issue is important for a number of reasons. Bank lending constitutes an important source of funding both for individuals as well as for smaller businesses. Likewise, large businesses make heavy use of bank borrowing as a form of short term financing. As such, the allocation of bank credit can have important real consequences for the economy. In particular, determining how the allocation of credit responds to shocks to the banking system may help us understand the channels by which the credit view of monetary policy works, and determine the relative impact of such policies across sectors of the economy. In addition, examining this issue may allow us to understand the allocative consequences of financial liberalization and cross-border deregulation policies.

To study this issue, we focus primarily on how borrowers characterized by different degrees of opaqueness are impacted when banks are hit by a negative shock and forced to curtail their lending, or, conversely, when banks are hit by a positive shock and choose to expand their lending. In other words, to the extent that borrower opaqueness generates a specificity that is an important driver of bank profitability, we believe that this might also be an important determinant of banks' credit allocation decisions.

The main finding of this paper is that, when forced to reduce lending, banks will reallocate their portfolio towards more opaque borrowers. This reallocation, which we call a "flight to captivity," may coexist with the "flight to quality" where banks faced with increased market interest rates tend to reduce lending to lower quality borrowers.³

The "flight to captivity" effect is the result of a twofold implication of "informational specificity" which up to now has not been analyzed. First, banks should obtain higher profits

¹See Sharpe (1990), Rajan (1992), and von Thadden (1998).

²Dell'Ariccia, Friedman, and Marquez (1999).

³A large literature has examined this phenomenon. See, for example, Asea and Blomberg (1998), Lang and Nakamura (1995), or Bernanke, Gertler, and Gilchrist (1996) and the references therein.

from more captured (more opaque) borrowers than from borrowers that have other financing alternatives. Second, when faced with liquidity needs, banks should be able to sell more profitably those assets whose value can be more easily evaluated by outsiders. Consequently, if during periods of curtailed lending banks retain their most profitable clients and are forced to sell their most liquid assets, we should expect to see a relative reallocation of bank credit away from more transparent borrowers and towards more opaque, more captured borrowers. Similarly, if banks find it easier to attract less captive borrowers when expanding credit, we should expect a relative reallocation of bank credit away from more opaque borrowers when banks are hit by a positive shock.⁴

The intuition for this result is simple. A borrower's demand for credit from its inside bank is a function of that borrower's other financing possibilities, such as ease of access to public debt markets or to financing by other banks. Easier access to alternative forms of financing should translate directly into a more elastic demand curve for bank credit, as one would expect borrowers with other sources of financing to be more sensitive to increases in interest rates charged by their inside banks. If access to credit correlates with the amount of public information available about a borrower, creditworthy but more informationally opaque borrowers will have a less elastic demand curve for bank credit than more transparent borrowers. Therefore, a bank forced to curtail lending will reduce credit relatively more to those borrowers with the more elastic demand (the less opaque borrowers) and retain a greater fraction of the more opaque (higher margin) borrowers, precisely because the former borrowers have alternative sources of credit.

In this paper we present a model of banking competition under asymmetric information that delivers the above predictions. We build a model where a lender with an informational advantage competes with a lender with worse information but with a cost advantage, and examine how credit allocation reacts to changes in the relative cost of funds for the two lenders. We then discuss two main applications for this framework. First, we apply this framework to the analysis of financial liberalizations such as those that have occurred recently in emerging markets and transition economies. Second, in the spirit of the "lending view," we apply this framework to analyze how bank credit allocation responds to monetary policy innovations.⁵

In the context of the application to financial liberalizations, the model offers some predictions on which groups of borrowers will be retained by local lenders and which groups will switch to new entrants. The situation we have in mind is one where, relative to local banks, foreign banks enjoy the advantage of a lower cost of funding, while they suffer the disadvantage

⁴In the case of a positive shock, the result is that the proportional expansion of bank credit will be greater in markets with more transparent borrowers, not that lending to opaque borrowers will be curtailed in order to lend to transparent borrowers.

⁵The bank lending channel view of monetary policy holds that not only do monetary contractions reduce the supply of bank loans, but that there are some borrowers for whom nonbank sources of credit are not perfect substitutes for bank loans. Therefore, when tight monetary policy forces a reduction in bank lending, bank-dependent borrowers are affected more than borrowers with alternative sources of financing. See Kashyap, Stein, and Wilcox (1993) for further implications of this view.

of having inferior information about local borrowers. Foreign banks will then be more effective at competing away from local banks the borrowers for whom the informational disadvantage is smaller, i.e., the borrowers that can effectively signal their quality to outside lenders (the less opaque borrowers). Conversely, local banks will retain a larger market share in segments where borrower quality is more opaque to external lenders. Note that the model in this paper examines only a particular aspect of financial liberalization and abstracts from important considerations and elements that also contribute to determine the likely positive impact of foreign bank entry in transition economies. Consequently, the results in this paper should not be interpreted as an argument against financial liberalization.

In the context of the application to monetary policy, our results can be compared to those of the "fight to quality" literature, which argues that creditors will optimally shift funds away from "high agency cost" borrowers during periods of recessions or when borrowers' balance sheets deteriorate. When agency costs of lending increase, lenders will reduce the amount of credit to firms requiring monitoring and shift funds towards safer alternatives.

In our framework, "flight to quality" and "flight to captivity" coexist. When a bank is hit by a negative shock (e.g., a relative increase in its cost of funding, or a reduction of its lending capacity relative to that of alternative sources of credit for its borrowers⁶), it does reduce lending to lower quality borrowers (which can be interpreted as a form of flight to quality). At the same time, this reduction is more pronounced for market segments where borrowers are less opaque and can find alternative sources of financing. This latter effect can be interpreted as a flight to captivity. Hence, these two effects, rather than opposing each other, act simultaneously along different dimensions. Therefore, this paper can be seen as an attempt to complement and expand the above-cited literature.

The paper proceeds as follows. Section 2 presents and analyzes the model. Section 3 applies the results to the analysis of a financial liberalization. Section 4 interprets the results in the context of a monetary policy innovation. Section 5 concludes.

II. MODEL

In this section, we examine how shocks to the cost of funds of individual banks affect their credit allocation decisions. We focus on a situation where an informed bank faces the competition of an uninformed bank.⁷ We analyze how the informed lender changes the allocation of credit across groups of borrowers characterized by different informational structures in response to

⁶In the appendix, we provide a model of competition between one informed lender with a limited capacity to grant loans and an uninformed lender that has an unlimited pool of funds at its disposal. There we show that a contraction to the informed lender's capacity, which we interpret as a monetary policy shock, causes this lender to reallocate its credit towards its more captured clients.

⁷In what follows, we use the terms "banks" and "lender" interchangeably. Similarly, we refer to bank customers as either "borrowers" or "entrepreneurs".

changes in its cost of funds relative to that of an uninformed lender.

This model uses a setup similar to that in Dell'Ariccia et al. (1999). We consider an economy where each entrepreneur is endowed with an investment project that requires a capital inflow of 1, but has no private resources, so that she must look to banks to obtain this financing. Projects pay off an amount R with probability θ , and 0 with probability $1-\theta$, and we assume that this outcome is perfectly observable and contractible by both parties, but that the parameter describing the probability of success, θ , is unknown to either the borrower or the bank before entering into a credit relationship. θ is uniformly distributed between 0 and 1, with average success probability $\overline{\theta} = 1/2$. We assume that once a borrower obtains a loan from a given bank, that bank learns the borrower's type θ . This learning generates a specificity in the bank-client relationship, as neither the bank nor the entrepreneur can credibly communicate the type information to other lenders.

In the market there are two kinds of borrowers: λ new borrowers and $1-\lambda$ old borrowers. Both of these groups have the same distribution over types given above. Moreover, we assume that banks are unable to distinguish between new borrowers and borrowers that are being rejected by a competitor bank or who are simply switching banks to take advantage of lower rates. This is admittedly a strong assumption. Generally borrowers carry with them some kind of credit history, and such history is usually publicly available to competitor banks. In defense, we argue that this assumption captures the idea that a borrower's inside bank possesses better information than what is available on a credit record. This information may be gathered through either monitoring or having access to books or simply through being able to better observe the kind of projects in which a borrower invests. In this sense, the borrower's old bank has an informational advantage over competitor banks, as new banks are only able to less precisely determine an applicant borrower's type.

The degree of specificity of the bank-client relationship is likely to vary across segments of the market. In this model, we capture that idea by assuming that the proportion of new and old borrowers varies across market segments. We assume that the market consists of a continuum of segments, each characterized by its proportion of new borrowers λ , where λ is public information.

From the above, we see that borrowers can be identified by two parameters: their profitability θ , and the proportion of new borrowers in their market segment λ . While θ has a natural interpretation as a measure of quality, we can interpret λ as the inverse of a measure of opaqueness: segments characterized by a larger proportion of new borrowers are those where the inside bank's information advantage is smaller. Indeed, as we will show in what follows, it is easier for outside banks to compete away clients from incumbent banks when λ is high.

⁸This setup provides us with a very simple measure of the degree of information asymmetry across banks. We believe that similar results would be obtained if we assumed that there were no new borrowers, but rather that the inside bank observed a private signal about the quality of its borrowers. We could then characterize the different markets by the quality (informativeness) of the signal being observed, with more opaque borrowers being those for whom the inside bank has very precise information.

We model the competition for borrowers in each segment in two stages. First, all banks simultaneously choose an interest rate for the pool of borrowers composed of all new (λ) plus all old rejected borrowers. Banks choose their gross interest rates from the set $[0,R]\cup\{\mathcal{D}\}$, where \mathcal{D} represents not offering a loan (denying credit). Then, after observing the realized rates for all banks, they simultaneously choose type-contingent interest rates for their old customers. We assume that borrowers act last by choosing the lowest available interest rate.

Suppose there are only two banks in the market. Specifically, consider a situation where one bank enjoys an informational advantage, while the other enjoys a lower cost of funding. In each segment, bank 1 (informed) has a pre-existing market share of one, and thus perfect information about all the old borrowers. Bank 2 (uninformed) has a pre-existing market share of 0, and thus no information about old borrowers. Bank 1 has access to an unlimited supply of funds at a constant gross interest rate, which we normalize to 1. Bank 2 has access to an equally unlimited supply of funds at a constant gross rate $\delta \in \left[\frac{1}{2}, 1\right]$.

Since the segments are perfectly distinguishable on the basis of λ , and both banks' costs are linear, we can treat all markets separately. Therefore, for a fixed market segment (for a fixed λ) we can write the profits for each bank as a function of their interest rate offers in that segment.

We solve the game by backward induction. We first characterize the equilibrium of the subgame after banks submit a bid to all new plus all rejected borrowers, when bank 1, the only bank with a pre-existing market share, bids for its old customers. Then we solve the first stage, where both banks compete for new borrowers.

It is straightforward to show that, in equilibrium, bank 1 is able to retain all of its borrowers of sufficiently good quality, and rejects all borrowers for whom lending at prevailing interest rates would yield it losses. This results from our assumption that bank 1 is always able to make a final offer to its old customers. To be explicit, let r_i be the interest rate charged by bank i to all unknown customers, and let $r_{1\theta}$ be the interest rate charged by bank 1 to an old customer of type θ (r_i denotes a gross interest rate, that is, net interest plus principal). To retain a customer, bank 1 needs to charge it a rate no higher than that being charged by bank 2. Therefore, all old borrowers retained by bank 1 are charged $r_{1\theta} = r_2$. But from this it is clear that only borrowers for whom $\theta \geq \tilde{\theta} \equiv \frac{1}{r_2}$ will be retained by bank 1. Note that $\tilde{\theta}$ can be thought of as a threshold or cutoff value of θ in order to obtain informed bank financing.¹⁰

We can now use the above to characterize the equilibrium of the whole game. A

⁹Note that this is equivalent to assuming that the informed bank has a cost *disadvantage*, so that its cost of funding is greater than $1 (= 1 + \xi, \xi > 0)$. Lowering δ is then equivalent to increasing ξ , so that we can look at shocks that increase the cost of funding to the informed bank in an equivalent way.

We also only consider values of $\delta \ge \frac{1}{2}$ since it is easy to show that for $\delta < \frac{1}{2}$, bank 2 always captures the entire market for new borrowers.

¹⁰This holds as long as bank 2 bids. If bank 2 does not bid, bank 1 can charge its old customers the maximum rate R without fear of losing them, so that the cutoff value $\tilde{\theta}$ becomes 1/R.

well-known result of models of competition under adverse selection is that the equilibrium in these models usually involves competitors playing mixed strategies.¹¹ This is also true in our model for parameter values that lead to true competition between the two banks. We offer the following characterization of the equilibrium in this game.

Proposition 1 A unique equilibrium to the two-stage game exists and is characterized as follows.

- 1. For $\delta < \underline{\delta}(\lambda) = \frac{3\lambda+1}{2(\lambda+1)}$, both banks bid $r = 1/\overline{\theta}$. Bank 1 obtains zero borrowers and profits, while bank 2 obtains positive profits.
- 2. For $\underline{\delta}(\lambda) \leq \delta < \overline{\delta}(\lambda) = \frac{\lambda R^2 + 1 \lambda}{2(\lambda R + 1 \lambda)}$, the unique equilibrium is characterized by a distribution function over strategies (interest rates and credit denial probability) for each bank, $F_i(r)$, i = 1, 2, where $F_i(r) = prob(r_i \leq r)$. In equilibrium, the uninformed bank (bank 2) makes zero expected profits from its new customers. The informed bank (bank 1) makes strictly positive expected profits from its new customers.
- 3. For $\delta \geq \overline{\delta}(\lambda)$, bank 2 does not bid. Bank 1 offers the monopolistic interest rate and makes positive profits.

Proof: See the Appendix for a more detailed characterization and proof. \Box

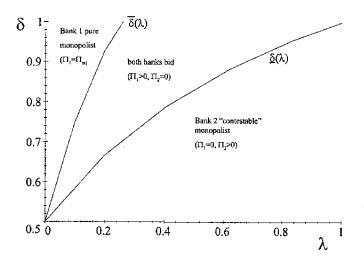
This proposition points out that, as long as bank 2's cost advantage is not too large, the informational advantage of bank 1 also endows it with a competitive advantage. The information advantage allows the informed bank to reap profits not just from its old customers but also from borrowers to which it has not previously lent, which in this case are just the new borrowers. Moreover, a sufficiently large informational advantage will grant bank 1 full monopoly power. At the other extreme, a very large cost advantage allows bank 2 to underbid bank 1 and drive it out of the market for new borrowers.

Figure 2 illustrates the regions characterized above. The proposition provides us with two bounds on δ as a function of λ which serve to partition the space. The first bound, $\underline{\delta}(\lambda)$, establishes the size of the cost advantage needed for bank 2 to be able to squeeze bank 1 out of the market. This bound is increasing in λ since higher values of λ imply lower degrees of information asymmetries for bank 2. The second bound, $\overline{\delta}(\lambda)$, tells us that if bank 1's information advantage is sufficiently large relative to bank 2's cost advantage, bank 2 will be unable to compete.

Having characterized the equilibrium, we proceed with the analysis. As emphasized earlier, we are interested in the allocation of credit by informed lenders when hit by a negative shock that causes them to curtail lending. Such a negative shock can be modeled as a shock to δ , with a *lowering* of δ , which decreases the cost of funding of an uninformed bank, being equivalent

¹¹This result has been established in models of banking competition in Broecker (1990) and von Thadden (1998), among others. See Dell'Ariccia et al. (1999) for a proof of the nonexistence of a pure strategy equilibrium in the context of a model similar to the one used in this paper.

Figure 1. Equilibrium for varying levels of information and cost advantage.



to raising the cost of funding to the informed bank (see an earlier footnote). The effects on credit allocaton in the two extreme regions of our partition are trivially null and will not be discussed here. Instead, we concentrate on the intermediate region, where both banks actually compete for borrowers and have positive expected market shares. As argued above, bank 1 grants credit to all borrowers of type $\theta \geq \tilde{\theta} = \frac{1}{r_2}$ as long as bank 2 bids, and $\frac{1}{R}$ otherwise. Therefore, the expected quality of the marginal borrower that obtains credit by the informed bank is $E[\tilde{\theta}] = \Pr(\text{bank 2 bids})E\left[\frac{1}{r_2}|r_2 \leq R\right] + (1 - \Pr(\text{bank 2 bids}))\frac{1}{R}$.

Corollary 1 The expected marginal borrower $(E[\tilde{\theta}])$ obtaining credit from an informed bank is:

- 1. increasing in λ : $\frac{\partial E[\tilde{\theta}]}{\partial \lambda} > 0$, and
- 2. decreasing in δ : $\frac{\partial E[\tilde{\theta}]}{\partial \delta} < 0$.

Proof: See the Appendix.

The corollary above follows directly from the proof of Proposition 3, where the mixing distributions for both banks, F_1 and F_2 , are constructed. As the severity of the information asymmetry decreases (i.e., as λ increases), the uninformed bank is able to bid more aggressively without fear of being saddled with only the informed bank's "lemons." This implies not only that $E[r_2]$ decreases, but also that the probability that bank 2 bids increases. This can then be shown to imply that $E[\tilde{\theta}]$ increases in λ .

One implication of this result is that, in equilibrium, the average quality of an informed bank's borrowers is lower for more opaque market segments. Another way of stating this is that, since profits depend on both the quality of a borrower as well as its transparency, low quality but highly opaque borrowers may be able to obtain bank financing even if better quality but more transparent borrowers are denied informed financing, and have to switch to alternative sources of credit.

Conversely, as δ increases, the cost advantage of the uninformed bank (or the cost disadvantage of the informed bank) is *reduced*. This leads the uninformed bank to bid *less* aggressively, so that $E[r_2]$ increases with δ . This implies that shocks that lower a bank's cost of funds (relative to a competitor) lead to reductions in $E[\tilde{\theta}]$, the expected cutoff quality level of borrowers obtaining (informed) bank financing. Note also that, as should be expected, the mass of borrowers granted a loan by the informed bank, $1 - E[\tilde{\theta}]$, is also reduced as its cost of lending increases.¹³

 $^{^{12}}$ This also allows us to apply the model to the case of a financial liberalization. There, a lower value of δ implies that the incumbent bank faces stiffer competition from an entrant. See section 4 for further discussion.

¹³This latter effect is reminiscent of the "flight to quality" effect (see, e.g., Bernanke et al. (1996)). When the informed bank suffers a shock that raises its cost of funds relative to alternative sources

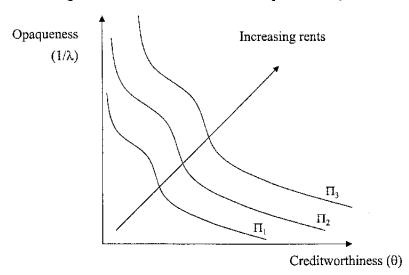


Figure 2. Two dimensions to loan profitability.

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However, one of our stated goals is to show that this reduction in bank 1's lending to low quality (but still creditworthy) borrowers is relatively more pronounced for market segments where borrowers are less opaque. For that we have the following result.

Proposition 2 The relative effect of a reduction in bank credit is larger in more transparent markets. Specifically,

$$\frac{\partial}{\partial \lambda} \left(\frac{\frac{\partial E[\tilde{\theta}]}{\partial \delta}}{1 - E[\tilde{\theta}]} \right) < 0. \tag{1}$$

Proof: See the Appendix.

This proposition illustrates our main result. When curtailing credit, banks cut lower quality borrowers first, and the proportion of borrowers cut is greater in more transparent market segments. One clear implication is that for two different markets segments characterized by λ_1 , λ_2 , with $\lambda_1 < \lambda_2$, a lower quality borrower of type $\theta_1 < \theta_2$ may be retained in market 1 even as a higher quality borrower of type θ_2 is released in market 2. This is exactly what we term the "flight to captivity" effect: when curtailing credit, banks are willing to cut higher quality borrowers in more transparent markets. An alternative interpretation of this result, discussed in a later section, is that banks entering new markets are more successful in competing away high quality borrowers from the local incumbent in relatively more transparent segments.

of credit, it raises the threshold quality level below which it denies credit. In other words, bank 1 reduces lending to less creditworthy borrowers, and allocates credit only to higher quality borrowers.

The results above demonstrate that bank profits can vary along two dimensions: quality and degree of informational capture. Moreover, the degree of informational capture, or an inside bank's information advantage, is increasing in the opaqueness of a borrower. Therefore, for a given amount of public information about a borrower, higher quality borrowers generate higher rents. However, it must also be true that, given the quality of a borrower (the success probability θ), more opaque (and therefore more captured) borrowers also generate higher rents (see Figure 4). This is exactly the intuition conveyed in the introduction: less opaque borrowers are precisely borrowers that have a more elastic demand for loans as they have less difficulty signaling their information to outsiders. The impact of a reduction in lending by an inside bank should therefore be felt more in this market that in the market of more opaque borrowers, who have a less elastic demand for loans.

Finally, it should be pointed out that, while more transparent borrowers find it more difficult to obtain bank (informed) financing, this does not necessarily imply that they are adversely affected as a result of the lowering of the cost of funds for the uninformed competitor. In fact, the logic of this section suggests that transparent borrowers benefit from this precisely because they have access to external sources of financing. Similarly, if we interpret a decrease in δ as an *increase* in the informed bank's cost of funds, we would have to conclude that transparent borrowers are likely to be least affected as they have the option to switch to an alternative source of financing.

III. FINANCIAL LIBERALIZATION

A natural application of the model is to the analysis of credit allocation and market structure in the wake of a financial liberalization in developing countries and transition economies, where informationally advantaged local banks often have to compete with cost efficient foreign banks. We discuss this application in more detail here.

Western banks first entered markets in emerging and transition economies by following their client firms from their domestic markets. Consequently, their initial activities consisted of providing cross-border services to multinationals that were expanding to these newly opened markets. However, their comparative advantage in the provision of high quality services and the relatively lower cost of funds allowed foreign banks in transition countries to become dominant in the highest segments of the market attracting the "best domestic customers." On the depositor side, these have been typically the richest individuals. On the borrower side, such clients have often been firms with relatively better accounting and reporting standards or with previously established international links by virtue of their import/export activities. With few exceptions, foreign banks have been initially reluctant to expand their activities beyond their established

¹⁴See Bonin, Mizsei, Szekely, and Wachtel (1998) for a general discussion of these issues. Bonin and Leven (1996) discuss the case of Poland, and van Elkan (1998) that of Hungary.

¹⁵Dittus (1994) makes these arguments for transition economies in central Europe, particularly for Poland and the Czech Republic.

niche, being concerned with the quality of the available information about average borrower firms. ¹⁶ Only later, and only in some cases, foreign banks have been able to gradually overcome informational barriers and have expanded their activities into retail markets (this is certainly the case in Hungary, where foreign and foreign-owned banks represent above half of the industry). ¹⁷

The predictions of the model naturally fit the pattern of foreign entry into the banking markets of transition economies. After the liberalization, foreign banks were able to attract the better and most transparent borrowers thanks to their cost advantage, while local banks retained a dominant position on more opaque clients by virtue of the superior information in their possession. A more complex dynamic model would likely show that, over time, foreign banks would expand their market share also in those segments where they initially had a very small presence.

The results from this paper are also consistent with the data from Japan following the deregulation of public bond markets. Hoshi, Kashyap, and Scharfstein (1993) argue that, after the liberalization in Japan, it was mostly older and higher net worth companies that were able to access public debt markets.

In the model, for the sake of simplicity, we have assumed that θ and λ are uncorrelated. However, in practice there likely exists a positive correlation between borrower quality and transparency, with important consequences for the effects of cross-border liberalization. The entry of foreign banks has the potential to change the loan portfolio composition of domestic banks not only with respect to the transparency of borrowers, but also with respect to their average quality. Foreign banks, attracting the more transparent borrowers, are likely to attract the more creditworthy ones as well, leaving domestic banks to deal solely with loans associated with opaque borrowers and characterized by higher risk.

As a result, the local banking system may find itself with a deteriorated loan portfolio and, thus, more prone to fall into financial distress in case of macroeconomic downturns. This seems consistent with recent work by Hoshi and Kashyap (1999) on the Japanese banking crisis. If high net worth correlates with age, quality, and the amount of publicly available information concerning these borrowers, this model would argue that Japanese banks might have been left with significantly worse loan portfolios after the deregulation of public bond markets.¹⁸

From this point of view, it becomes crucial that adequate supervisory and prudential frameworks be put in place before the banking sector is liberalized. Furthermore, the entry of foreign banks through the acquisition of existing domestic institutions (with the associated

¹⁶See Bonin, Mizsei, Szekely, and Wachtel (1998).

¹⁷The fact that retail markets have begun to expand only recently may have also played a role in that context.

¹⁸Also consistent with this, Claessens, Demirguc-Kunt, and Huizinga (1998) show that, for a very large sample of countries, loan loss provisions of domestic banks are higher in markets with a large foreign bank presence. While much work needs to be done to provide an appropriate test of this model, these findings suggest that foreign bank entry may leave domestic banks to cater to relatively less creditworthy customers.

improvement in technology and managerial ability) should be preferred over de-novo entry.

It is worth noting that this model does not take into account the potential benefits associated with the entry of foreign banks (such as better management practices, superior technology, more market discipline etc.). Consequently, the ideas in this paper should not be taken as an argument against financial liberalization, but rather as suggestion of which may be some of the risks associated with it.

IV. MONETARY POLICY SHOCKS

The bank lending channel view of monetary policy has argued that, since nonbank loans are not perfect substitutes for bank loans for some borrowers, monetary policy contractions that force banks to curtail lending (or expansions that lead to an increase in bank lending) have real effects beyond those resulting from the conventional money channel. Consistent with this view, there has been recent evidence showing that bank lending is indeed susceptible to monetary policy innovations (Kashyap and Stein, 1995) and that borrowers are differentially affected by monetary contractions (Kashyap and Stein, 2000). The model from section II can be used to analyze how bank credit is allocated following a monetary policy contraction.

In the context of our model, we can interpret bank 1, with private information about the market and with a cost of funds of 1, as representing the banking sector in the economy, and bank 2, with no private information but with a lower cost of funds δ , as any other non-bank source of financing. An increase in bank 1's cost of funds, which is captured in our model by a lowering of δ , can then be interpreted as a forced reduction in bank lending resulting from a monetary contraction that causes reserves to flow out of the system.²⁰ The model implies that banks should cut lending relatively more to borrowers who, because they have alternative sources of financing, are more sensitive to interest rate changes on their bank loans. These borrowers are precisely the more transparent borrowers in our model, who, because they are better able to signal their quality to other lenders, do not expose these competing lenders to large adverse selection problems. This is exactly what we call the "flight to captivity," in that banks should attempt to retain their more profitable loans following a monetary contraction. These loans are very often the ones to borrowers with few alternatives for financing.²¹

¹⁹The "money" channel for monetary policy is simply the conventional effect through the liability side of banks' balance sheets: as reserves flow out of the system, there is a fall in the stock of money.

²⁰In this, we follow the general view that monetary policy impacts more severely the banking system than disintermediated capital markets.

See the appendix for a model similar to that presented in the text where the effect of a monetary policy innovation works directly through a bank's balance sheet. That model yields similar predictions.

²¹An alternative interpretation is that banks should sell their more liquid assets when faced with a need to raise capital. These assets are just loans to their most transparent borrowers, so that those are the loans that are sold first.

It is worth emphasizing that, while more transparent borrowers are denied bank credit, these borrowers are not necessarily the ones that are most impacted as a result of the monetary contraction. Bank lending to the more transparent sectors is curtailed (or liquid loans are sold) precisely because these borrowers have alternative sources of financing they can tap, and so are very sensitive to increases in interest rates.²²

This effect might help explain why a bank-lending channel for monetary policy has been difficult to identify in the data. The bank lending channel is important only if banks have to reduce their loans, and if borrowers are bank-dependent. In our model, even if total loans are reduced, they will increasingly be allocated precisely to those borrowers that are more opaque or bank-dependent. This compositional change reduces the impact of monetary contractions on bank-dependent borrowers.

Note also that, as alluded to in the introduction, the results can also be seen to incorporate a "flight to quality" effect in that, for a given level of opaqueness, banks first shed their lower quality loans before getting rid of their high quality loans. Monetary contractions therefore have the effect of reallocating bank credit away from both low quality and more transparent borrowers, and towards better quality but also more captured borrowers.

It is worth noting here, however, that the driving forces behind what we call a "flight to quality" effect in this paper are somewhat different from those described in the traditional macroeconomics literature. There, recessionary periods cause a deterioration of borrowers' balance sheets, which worsens the agency problems faced by creditors. This effect induces creditors to shift funds away (recall loans) from "high agency cost" borrowers. In our model, borrowers' creditworthiness need not change. Monetary policy acts by raising the cost of banks' liabilities, leading banks to reduce their lending to marginal quality borrowers. These two mechanisms would have similar empirical implications if high agency cost borrowers were also the less creditworthy ones and if monetary policy contractions negatively impact borrowers' balance sheets. The main implication of both of these approaches is that lenders may shift their resources towards higher quality borrowers when either the lender or the borrower suffers a negative shock.

V. CONCLUSIONS

This paper presented a framework for analyzing how competition among financial intermediaries affects credit allocation under asymmetric information. It showed that, when there are informational asymmetries among lenders, the profitability to a bank of granting a loan is determined along two different dimensions. First, the quality of the borrower in terms of creditworthiness affects the bank's expectation of recovering the invested funds. Second, the

²²However, in a model with limited lending capacity (as in the Appendix), the more opaque borrowers would suffer a form of credit rationing as a result of the contraction of the banking sector, as marginal (and even some good) risks that are released by banks are unable to obtain financing elsewhere.

degree of opacity of the borrower, or its ability to credibly communicate its quality to outside lenders, affects the bank's ability to extract monopolistic rents by charging high interest rates. This paper showed that when forced to curtail lending, banks take into account these two dimensions of loan profitability by reallocating their loan portfolio towards both more creditworthy and more opaque borrowers.

In this paper, we do not model the liability side of banks' balance sheets. It has been suggested that banks with more transparent portfolios may have cheaper access to funds (in the absence of deposit insurance) and may therefore be favored by regulators. In such a case, concern over transparency of the liability side might counteract the asset side effect and mitigate the results in this model. We leave that extension for future research.

The framework in this paper can be applied to two different contexts. First, it may us help understand the changes in bank portfolio associated with liberalization reforms that bring new banks into the market, such as those that have taken place in transition economies and some emerging markets. Second, in the spirit of the "lending view," it may help to explain the changes in the allocation of aggregate credit associated with monetary policy innovations.

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PROOFS OF RESULTS FROM SECTION II

As argued in the text, in the subgame after offers to new borrowers have been made, bank 1 can retain any borrower by matching the rate of its competitor, r_2 . From this it is obvious that the only old borrowers retained are those of sufficiently high quality, so that $\theta r_2 \ge 1 \Rightarrow \theta \ge 1/r_2$. We can now define the pool of borrowers applying to bank 2 as all new borrowers plus all borrowers rejected by bank 1.

Consider then the competition for these borrowers. Using the argument above, the banks' profits on unknown borrowers, conditional on "winning" the market for new borrowers (having the strictly lowest rate), are

$$\pi_{1}(r_{1}|w) = \lambda \int_{0}^{1} (r_{1}\theta - 1)d\theta = \lambda(r_{1}\overline{\theta} - 1)$$

$$\pi_{2}(r_{2}|w) = \lambda \int_{0}^{1} (r_{2}\theta - \delta)d\theta + (1 - \lambda) \int_{0}^{\frac{1}{r_{2}}} (r_{2}\theta - \delta)d\theta$$

$$= \lambda(r_{2}\overline{\theta} - \delta) + (1 - \lambda) \int_{0}^{\frac{1}{r_{2}}} (r_{2}\theta - \delta)d\theta$$
(A-2)

The second term in equation (I-2), which can be written as $(1 - \lambda) \frac{1}{r_2} (\frac{1}{2} - \delta)$, is negative for $\delta > \frac{1}{2}$, since bank 1 only casts out those borrowers for which $\theta r_2 < 1$.

Conditional on losing, bank 1 simply makes zero profits as it makes no new loans. Bank 2, however, makes loans to bank 1's rejected borrowers, so that its payoff is given by

$$\pi_2(r_2|l) = \int_0^{\frac{1}{r_2}} (1-\lambda)(r_2\theta - \delta)d\theta,$$
 (A-3)

Note that while equation (I-3) is negative, equation (I-2) can be positive for sufficiently large values of r_2 or low values of δ . This is simply because no adverse selection effects operate with respect to the new borrowers (the first term in equation (I-2)), so that their expected repayment probability is the mean of the full distribution of borrowers.

This observation gives us the bound in part 3 of Proposition 3. In order for bank 2 to be willing to bid at all, it must be able to obtain positive profits from doing so, at least some of the time. Therefore, if $\pi_2(R|W)<0$, bank 2 will never bid, since even if it were to have the monopolistic rate and were to be assured of winning it would still make losses. Using equation (I-2) we derive the cutoff value of $\overline{\delta}(\lambda)$ such that bank 2 is willing to bid at all. For $\delta \geq \overline{\delta}(\lambda)$, bank 2 never bids, and bank 1 offers the monopolistic interest rate to all of its customers and to any new customers.

To obtain the bound in part 1 of Proposition 3, notice that, if $\delta \leq \frac{1}{2}$, $\pi_2(R|L)$, given by equation I-3, will always be positive for any value of λ . Moreover, for $\delta < \underline{\delta}(\lambda) = \frac{3\lambda+1}{2(\lambda+1)}$, bank 2 can always undercut bank 1 by bidding $r_2 = 1/\overline{\theta}$ and still make positive profits. Therefore, in

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equilibrium banks 1 and 2 bid the rate $r=1/\overline{\theta}$, and bank 2 always obtains the entire market.²³

For $\underline{\delta}(\lambda) \geq \delta < \overline{\delta}(\lambda)$, we can now state the following proposition regarding the equilibrium of the full game. Note that this result is just a restatement of Proposition 3.

Proposition 3 A unique equilibrium to the two-stage game exists and is characterized by a distribution function over strategies (interest rates and credit denial probability) for each bank, $F_i(r)$, i=1,2, where $F_i(r)=\operatorname{prob}(r_i\leq r)$. These distribution functions are continuous and strictly increasing over an interval $[\underline{r},R)$, where $\underline{r}=\delta+\frac{1}{\lambda}\sqrt{\lambda^2\delta^2+\lambda\left(2\delta-1\right)\left(1-\lambda\right)}$. The equilibrium has the following additional properties:

- 1. The uninformed bank (bank 2) makes zero expected profits from any new customers. The informed bank (bank 1) makes strictly positive expected profits from any new customers.
- 2. The uninformed bank (bank 2) refrains from bidding for new borrowers with positive probability, so that $1 F_2(R) > 0$ (the probability that bank 2 plays the strategy D is positive).
- 3. Bank 1 bids $r_1 = R$ with positive probability $(\mu_1(R) > 0$, where $\mu_i(r)$ represents the mass F_i puts on r, if any: $prob(r_i < r) = F_i(r) \mu_i(r)$).

Proof: This model fits the setup in Dell'Ariccia, Friedman and Marquez (1999), with pre-existing market shares of 1 for one bank (bank 1) and 0 for the other (bank 2). For values of δ within the specified bounds, the proof in that paper follows directly. The lower bound of the mixing distributions, \underline{r} , can be obtained directly from the zero-profit condition for bank 2,

$$\lambda \left(\frac{1}{2}\underline{r} - \delta\right) + (1 - \lambda) \int_{0}^{1/\underline{r}} (\underline{r}\theta - \delta) d\theta = 0$$
, which when solved for \underline{r} yields the expression above. \square

Proof of Corollary 2: Recalling that $\tilde{\theta} = \frac{1}{r_2}$ whenever bank 2 bids, and $\frac{1}{R}$ otherwise, we can write that $E[\tilde{\theta}] = F_2(R)E\left[\frac{1}{r_2}|r_2 \leq R\right] + (1-F_2(R))\frac{1}{R}$, since $F_2(r)$ is the probability of a bid by bank 2. Expanding this, we can write this expectation as

$$E[\tilde{\theta}] = F_2(R) \frac{\int_r^R \frac{1}{r} dF_2(r)}{F_2(R)} + (1 - F_2(R)) \frac{1}{R} = \int_r^R \frac{1}{r} dF_2(r) + (1 - F_2(R)) \frac{1}{R}$$

We first integrate this by parts to get a simpler expression:

$$E[\tilde{\theta}] = \frac{1}{R} + \int_{\underline{r}}^{R} \frac{1}{r^2} F_2(r) dr$$

²³Strictly speaking, bank 2 must bid a rate of $r_2 = 1/\bar{\theta} - \epsilon$ in order to win the entire market. This is the usual Bertrand result, that the equilibrium of the game is characterized by taking the limit as ϵ goes to zero.

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Therefore, the derivative of this expression is

$$\frac{\partial E[\tilde{\theta}]}{\partial \lambda} = \int_{\underline{r}}^{R} \frac{1}{r^2} \frac{\partial F_2(r)}{\partial \lambda} dr - \frac{\partial \underline{r}}{\partial \lambda} \frac{1}{\underline{r}^2} F_2(\underline{r}) = \int_{\underline{r}}^{R} \frac{1}{r^2} \frac{\partial F_2(r)}{\partial \lambda} dr,$$

since the second term is just zero. We obtain F_2 from Proposition 3 as

$$F_2(r) = \frac{\overline{\theta}(r-\underline{r})}{(r\overline{\theta}-1)}$$

From the definition of \underline{r} , it is clear that $\frac{\partial}{\partial \lambda}\underline{r} < 0$. This then implies that $\frac{\partial F_2(r)}{\partial \lambda} > 0$. Since $\frac{1}{r^2}$ is also positive, the integral must be positive, and we can conclude therefore that $\frac{\partial E[\tilde{\theta}]}{\partial \lambda} > 0$, as desired.

The second part of the corollary is proven similarly. We first show that $\frac{\partial}{\partial \delta}\underline{r} > 0$, so that $\frac{\partial F_2(r)}{\partial \lambda} < 0$. This then implies that $\frac{\partial E[\bar{\theta}]}{\partial \delta} < 0$, as desired. \square

Proof of Proposition 1: The derivative in the proposition can be written as

$$\frac{\partial}{\partial \lambda} \left(\frac{\frac{\partial E[\tilde{\theta}]}{\partial \delta}}{1 - E[\tilde{\theta}]} \right) = \frac{\frac{\partial^2 E[\tilde{\theta}]}{\partial \lambda \partial \delta} \left[1 - E[\tilde{\theta}] \right] + \frac{\partial E[\tilde{\theta}]}{\partial \lambda} \frac{\partial E[\tilde{\theta}]}{\partial \delta}}{\left[1 - E[\tilde{\theta}] \right]^2}$$

The product of the last two terms in the numerator is negative (Corollary 2). Numerical simulations show that the overall expression is negative as well for all values of λ and δ such that the proposed equilibrium where both banks bid exists and for values of R > 2. Therefore, the relative reduction in lending by bank 1 is greater in more transparent markets. \square

- 20 - APPENDIX II

MODEL WITH DIFFERENTIAL LENDING CAPACITIES

Here we provide a model where the effect of a monetary policy shock directly affects bank credit by compressing bank lending capacity through a reduction of the deposit base ("lending view").²⁴ This model provides a framework for thinking about how banks reallocate their lending in response to such negative shocks. In this setup, a bank with limited capacity and superior information competes with a non-bank financial intermediary with unlimited capacity, but inferior information. We assume that the bank with limited lending capacity operates in two separate markets segments. The two segments are characterized by different market and information structures. To keep things simple, we push these differences to the extreme as described in what follows.

The first segment is a competitive market, meaning that the bank and non-bank financial intermediary compete for borrowers. In this market segment information flows freely across financial intermediaries, and bank-client relationships are not specific. Consequently, the two lenders are symmetrically informed when competing for borrowers. For simplicity, we assume that no client-specific information is available to either bank and that lenders only know the type distribution of potential borrowers. In the notation of the model in the text this would correspond to a market with $\lambda=1$.

The second segment is a monopolistic market, meaning that the bank's informational advantage is proof against the threat of entry by any potential competing lender. ²⁵ Again for simplicity, we assume that the bank has specific information about the type of every individual borrower in the market. In the notation of the model in the text this would correspond to a market with $\lambda=0$.

A. Equilibrium analysis

We refer to bank 1 as the informed bank, and bank 2 as the uninformed intermediary, which can stand for an anonymous credit market or any other arm's length lender. We also refer to market M as the monopolistic market where only bank 1 is active and has private information about its customers, and market C as the competitive market where both lenders are active and equally informed. We assume that bank 1 has a capacity K to be allocated between loans to markets M and C, with quantities given by K_M and K_C , respectively.

Each market has a mass of borrowers of size one and the distribution of borrower types across both markets is identical. Borrowers are defined as in the text, with projects yielding either 0 or R, and are characterized by a probability of repayment θ , which is uniformly distributed between 0 and 1.

²⁴For example, see Kashyap and Stein (2000) and references therein.

²⁵This assumption puts a constraint on the minimum level of lending capacity for the bank. For the condition guaranteeing an informational natural monopoly in this setup, but without binding capacity constraint, see Dell'Ariccia, Friedman, and Marquez (1999).

For simplicity, we structure the model as a two stage game. In the first stage, bank 1 decides how to allocate its lending capacity between the two market segments. In the second stage, banks 1 and 2 compete over interest rates in the competitive segment; bank 1 maximizes its profit as a monopolist in the protected segment (market M).

We solve the game by backward induction. First, consider the sub-game where the capacity constrained bank and the unconstrained alternative lender compete for unknown borrowers under symmetric information.

Proposition 4 For any $K_C < 1$, a unique mixed-strategy equilibrium for the sub-game exists and is characterized by a distribution function over interest rates for each lender, $F_i(r)$, i = 1, 2, where $F_i(r) = prob(r_i \le r)$. The equilibrium has the following properties:

- i) Both lenders make strictly positive profits.
- ii) Both lenders play completely mixed strategies over the interval $[\underline{r},R]$, where \underline{r} is defined below.
- iii) The mixing probabilities of either lender are continuous and strictly increasing over the interval $[\underline{r}, R)$. The unconstrained lender's mixing distribution has an atom at R.

Proof. The proof of the existence of a mixed strategy equilibrium is standard. Moreover, it is straightforward to show that the mixing distributions, F_1 and F_2 , satisfy the conditions above in that they are continuous and strictly increasing, and contain no atoms in the interval [r, R).

For the rest of the proposition, consider the following argument. Given $K_C < 1$, $(1 - K_C) \left(R \overline{\theta} - 1 \right) > 0$ represents a lower bound for the unconstrained lender's profits. Then, as a result of the usual mixed strategy argument, the unconstrained lender has also to make positive profits at the lower bound of the mixing distribution (which must be the same for both lenders). This means that $r > 1/\overline{\theta}$, and hence that both lenders make positive profits in equilibrium. This also implies that both lenders make an interest rate offer with probability one. Consequently in order for both banks to make positive profits at the highest possible interest rate, R, one has to have an atom at R. This has to be the unconstrained lender, as the constrained lender, bank 1 would make zero profits if its probability of winning were zero at $r_1 = R$.

This establishes that the equilibrium profits for bank 2 are

$$\Pi_2^* = (1 - K_C) \left(R \overline{\theta} - 1 \right) .$$

Since profits have to be the same for every interest rate offered in equilibrium, we can determine the lower bound of the bidding distributions from the equation

$$\underline{r}\overline{\theta} - 1 = (1 - K_C) (R\overline{\theta} - 1)$$
,

which gives us

$$\underline{r} = \frac{1}{\overline{\theta}} + \frac{(1 - K_C) \left(R \overline{\theta} - 1 \right)}{\overline{\theta}},$$

that, as expected, converges to $1/\overline{\theta}$ as $K_C \to 1$.

We now can write the equilibrium profits for the constrained bank

$$\Pi_C^* = \Pi_C(\underline{r}) = K_C(\underline{r}\overline{\theta} - 1) = K_C(1 - K_C)(R\overline{\theta} - 1),$$

which are positive for $K_C < 1$.

Now consider the solution of the monopolist problem in market M. Since it faces no competition in this market, bank 1 should charge all of its credit worthy borrowers the maximum rate R, and make loans up to its capacity on this market. Given its capacity constraint, its profits, denoted by Π_M , can be written as

$$\Pi_M = \int\limits_{ heta}^1 \left(R heta-1
ight)d heta$$
 ,

where $\underline{\theta}$ is determined by the capacity constraint. Since θ is uniformly distributed between 0 and 1, we simply have $\underline{\theta} = 1 - K_M$, and

$$\Pi_{M} = \int_{1-K_{M}}^{1} (R\theta - 1) d\theta = \frac{R}{2} (2K_{M} - K_{M}^{2}) - K_{M},$$

From the analysis of the equilibria in the subgames, we can show that, in stage 1, bank 1 maximizes expected profits

$$\Pi_1 = \frac{R}{2}(2K_M - K_M^2) - K_M + K_C(1 - K_C)(R\overline{\theta} - 1)$$

with respect to K_M and K_C , subject to the constraint that $K_M + K_C = K$. This leads us to the following proposition.

Proposition 5 The equilibrium of this game in stage 1 is characterized by a capacity allocation $\{K_M^*, K_C^*\}$ by bank 1, where $K_M^* = \frac{R(1-\overline{\theta})+2K(R\overline{\theta}-1)}{R+2(R\overline{\theta}-1)}$ and $K_C^* = K - K_M^* = \frac{KR - R(1-\overline{\theta})}{R+2(R\overline{\theta}-1)}$.

Proof: This follows directly from the first order conditions for profit maximization of the above equation. \Box

Proposition gives us the optimal allocation of bank 1's capital across the two market segments, for a given level of total capacity K. However, our concern is with how banks readjust their loan portfolios following a shock to bank capital.

Corollary 2 Lending is cut (increased) relatively more following a contraction (expansion) in

bank 1's capital in the competitive market (C) than in the monopolistic market (M):

$$\frac{\left(\frac{\partial K_M}{\partial K}\right)}{K_M} < \frac{\left(\frac{\partial K_C}{\partial K}\right)}{K_C}$$

The proposition above shows that the elasticity of K_M with respect to changes in total capacity is smaller than that of K_C . The interpretation of this result is straightforward. A contraction of lending capacity results in a relative reallocation of lending away from market C, the competitive market, and towards market M, the monopolistic market. In other words, bank 1 rebalances its portfolio in favor of more captive borrowers.

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