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Banks and FinTech Acquisitions

Abstract

This paper investigates ex-ante factors influencing international bank acquisition of FinTech companies from 2010-

2018. Using hand-collected data, we show that bank boards with a larger female presence as well as those that have

CEOs with longer tenure are more likely to pursue FinTech acquisitions. The financial performance also matters as

banks with greater capital strength and liquidity are more likely to be acquirers. In line with prior expectations,

banks with higher IT spending, suggesting greater in-house development of digital solutions, are less likely to target

FinTech acquisitions. In addition, younger CEOs and banks with lower IT spending are also found to be more likely

to make multiple FinTech acquisitions. The nationality diversity in the boardroom matters for cross-border bank-

FinTech deals.

Keywords: FinTech; Bank acquisitions; Corporate governance; International Banking

JEL classification: G3; G21; G34; O33

1. Introduction

The recent emergence of technology-driven innovation in financial services, or "FinTech", is significantly reshaping the banking industry.¹ The digital shift marked by huge technological advances during the past decade is seen as unavoidable and unstoppable, forcing established banks to rethink their position in a rapidly changing landscape.² Embracing new digital technology to successfully transform the old way of performing key functions represents an opportunity for traditional banks to leverage existing strengths and compete with new market participants. Such a transformation enables banks to promptly embrace the digital era and enhance their technological flexibility. The potential of FinTech adoption to improve banks' productivity and efficiency, by reducing costs, is also likely to make the overall financial system more resilient and inclusive, opening the doors to under-banked and unbanked segments of the population (Carney, 2017; Philippon, 2019; Demir et al., 2020; Frost, 2020).

With the aim of effectively responding to rising competition and pressure to innovate, incumbent banks can follow various approaches to engage with FinTech, such as *ad-hoc* partnerships, increasing investments in new technologies, and the acquisition of existing FinTech firms.³ Among this range of strategies, we particularly focus on acquisition activity and investigate a comprehensive set of *ex-ante* factors driving international banks to acquire FinTech players as compared to a group of non-acquiring banks. What are the main driving forces behind banks' likelihood to acquire FinTech? Are domestic/cross-border acquisitions and single/multiple deals driven by different factors? This paper seeks to answer these two main research questions.

An acquisition strategy can shorten (costly) in-house development of new solutions, while effectively increasing a bank's digital footprint. Moreover, despite the usual evaluation challenges associated with acquisitions, which can potentially be exacerbated in the case of FinTech, this strategy presents some key advantages in terms of exclusivity, rapid access to new clients/markets, and data security.⁴ According to KPMG (2018), FinTech mergers and acquisitions (M&As) in the banking industry are gaining momentum and are likely to be preferred over partnerships in order to meet strategic objectives.⁵ Examples of relevant deals, that occurred in 2017-2018 and are

¹ The Financial Stability Board (<u>FSB 2017</u>, p.7) defines FinTech as "technology-enabled financial innovation that could result in new business models, applications, processes, or products with an associated material effect on financial markets and institutions and the provision of financial services". This definition has also been adopted by the Basel Committee on Banking Supervision (BCBS).

² The current and third phase of FinTech, where non-bank players use new key technologies to provide financial services directly to clients, started around the 2008-global financial crisis (<u>Thakor, 2020</u>). The initial phase, between 1866-1967, refers to the first transatlantic cable and the introduction of the telegraph. The second phase, between 1967-2008, regards the rise and development of electronic payments and clearing systems, as well as the Automated Teller Machines (ATMs) and online banking.

³ Based on a <u>2017 KPMG</u> survey, "emergining FinTech" represents the greatest source of disruption for financial instutions, followed by "growing global regulatory complexity" and "new business models".

⁴ Acquisition, rather than internal development, can be a preferred strategy when the targeted resources are distant from the acquirer's area of expertise or when rapidity is key (Capron and Mitchell, 2009; Lee and Lieberman, 2010).

⁵ Besides these considerations, our focus on acquisitions, rather than other forms of integration, has been also motivated by the data. Specifically, we were able to retrieve systematically organized and clearly filtered data on banks' FinTech acquisitions (refer to Section 3.1).

included in our dataset, are the acquisition by Deutsche Bank of Quantiguous Solutions, a FinTech start-up specializing in digital banking solutions, and those by ING and JPMorgan Chase with two providers active in the digital payments services (Payvision and WePay, respectively).⁶

In this study, we investigate a broad set of potential ex-ante factors driving banks to acquire FinTech companies. This paper contributes to the literature by extending the growing, yet still limited, empirical evidence on the relationship between FinTech and banking (Buchak et al., 2018; Claessens et al., 2018). Indeed, most of the existing studies are descriptive in nature (Vives, 2017; Stulz, 2019; Thakor, 2020; amongst others). Moreover, prior research on bank M&As mainly focuses on (i) the ex-post valuation of M&As, in terms of performance and efficiency; and (ii) bank-specific characteristics associated with becoming a target in M&As (Hernando et al., 2009; Goddard et al., 2012; amongst others), while limited attention has been devoted to ex-ante factors.⁷ Our paper relates to the literature on firm boundaries (Rhodes-Kroph and Robinson, 2008; Robinson, 2008; Bena and Li, 2014). For instance, Robinson (2008) develops a model that explains firms' preference for strategic alliances over internal projects. Although we focus on M&As, rather than strategic alliances, these also lead to organizational changes where a set of resources is moved across firm boundaries. In a similar fashion, Rhodes-Kropf and Robinson (2008) investigate the element of "who buys whom" in the M&A activity. Bena and Li (2014) further underline the importance of understanding the ex-ante drivers of M&As in the corporate innovation context given their potential impact on the synergy (outcome) of the acquisitions. We thus contribute to the extant literature by informing on the specific features that lead banks to make acquisitions aimed at replacing (or complementing) outdated legacy technology and the shift toward digital banking business which can better address customers' evolving demands. In addition, we gain insights into the underlying strategic approach followed by international banks in terms of their governance features, balance-sheet characteristics, and macroeconomic/institutional factors that determine the decision to buy a FinTech company. Furthermore, by examining a cross-country sample, we are also able to capture a greater degree of heterogeneity than in prior studies on bank M&As, which mostly focus on a single country/region (for instance, Focarelli et al., 2002; Pasiouras et al., 2011). To the best of our knowledge, our analysis substantially advances the understanding of banks' acquisition of FinTech companies and highlights the variation in the determining factors related to such activity.

In addition, we also extend the literature on CEOs' individual characteristics and corporate behavior.⁸ Existing studies mainly focus on non-financial firms, so we add to this by focusing on the banking industry. Furthermore,

⁶ The terms of the acquisition of Quantiguous Solutions, as well as those of WePay, have not been disclosed. ING has paid €260 million to acquire a 75% stake in Payvision.

⁷ Refer to <u>Amel et al. (2004)</u> and <u>DeYoung et al. (2009)</u> for detailed reviews of the international evidence on *ex-post* effects of M&As in the financial sector.

⁸ A relatively large body of literature (<u>Bliss and Rosen, 2001</u>; <u>Datta et al., 2001</u>; <u>Hagendorff and Vallascas, 2011</u>; among others) focuses on the relationship between CEO's personal wealth benefits and acquisitions.

the paper contributes to the scarce literature on CEOs' personal traits and innovation. Finally, our analysis contributes to the literature on the relationship between board diversity and corporate acquisitions. Prior literature mainly looks at the impact of female directors on (i) corporate governance and firm performance (for instance, Adams and Ferreira, 2009; Bennouri et al., 2018; Green and Homroy, 2018); and (ii) firm risk-taking (Huang and Kisgen, 2013; Sila et al., 2016; amongst others). More limited is the empirical evidence on the relationship between female board representation and corporate acquisitions. Board nationality diversity may also play a relevant role, given the greater possibility to exploit directors' diverse functional backgrounds and skill sets, which can be beneficial when engaging in complex assessments, such as those involving innovation-driven acquisitions (Bantel and Jackson, 1989). The question of how bank governance features in general, including board diversity, affects FinTech acquisitions is not explored (as far as we are aware) in the literature.

The first set of considered factors in our study embraces bank corporate governance characteristics. To the extent that technology acquisitions present unique features and challenges (Ranft and Lord, 2002; Graebner et al., 2010), we believe that deals within the FinTech sector might present further distinctive characteristics, thereby requiring specific individual features. Nowadays, firm leaders must be sufficiently agile and prepared to quickly respond to the evolving environment, the changing customers' needs and the advances in technology. In the finance industry, the pace at which new technologies are tested and incorporated is faster than ever before (Goldstein et al., 2019). Motivated by this, we anticipate that CEO-specific characteristics have a significant impact on corporate and strategic decisions (Bertrand and Schoar, 2003; Yim, 2013; Acemoglu et al., 2014; Serfling, 2014; Wang and Yin, 2018; Meyer-Doyle et al., 2019; Chen et al., 2020), including the likelihood to acquire a FinTech firm. In addition to the CEO characteristics, board size and composition variables are employed as supported by prior literature. In particular, empirical research highlights the significant impact of board characteristics on decision-making including acquisition decisions (Ferreira, 2011; Masulis et al., 2012; Levi et al., 2014; Ferreira, 2015; Chen et al., 2016; Estélvi and Nisar, 2016).

Second, we account for bank-specific factors. <u>Focarelli et al. (2002)</u> find that acquiring banks are on average more profitable than targets and driven by credit management objectives. <u>Pasiouras et al. (2011)</u> document a positive

⁹ In a seminal contribution, <u>Bantel and Jackson (1989)</u> explore the relationship between the personal features of banks' top managers and innovation adoptions. The authors show that more innovative banks are led by more educated and diverse teams. <u>Yadav et al. (2007)</u> demonstrate that the CEO's attentional focus plays a crucial role in driving innovation. Outside the banking sphere, <u>Galasso and Simcoe (2011)</u> argue that overconfident CEOs, who potentially underestimate risks, are more likely to promote innovation. <u>Custódio et al. (2019)</u> argue that firms led by more generalist CEOs tend to produce more patents.

¹⁰ With reference to the banking industry, a number of contributions explore how boardroom gender diversity affects bank risk (<u>Berger et al., 2014</u>; <u>Palvia et al., 2015</u>; <u>Farag and Mallin, 2017</u>; <u>Cardillo et al., 2020</u>; <u>Arnaboldi et al., 2021</u>; amongst others).

¹¹ The digitalisation process must be driven by the top, fostering innovation within the entire organisation, while changing the existing culture. For instance, the current CEO of JPMorgan Chase, Jamie Dimon, has declared the intention of the bank to become more aggressive and creative in its acquisition strategy, by especially targeting FinTech firms. Refer to www.pymnts.com/news/banking/2020/jpmorgan-ceo-bank-plans-fintech-other-acquisitions/.

Frantz (2013) finds that size, growth, cost efficiency and capital strength influence the banks' propensity to become acquirers. Lastly, with reference to the countries where the acquiring banks are located, we account for a set of macroeconomic and institutional factors, such as GDP growth, government effectiveness, and the number of physical bank branches.

By using an international sample, focusing on banks acquiring and non-acquiring FinTech companies over 2010-2018, we aim to identify which features at the governance-, bank-, and country-level drive (or impair) the acquisition decision. We use probit and multinomial probit models to conduct the empirical analysis to address our research questions. In addition, we also shed some light on the acquisition behavior of banks that acquire Fintech companies more than once, as well as the specific drivers behind cross-border deals.

We document a positive (inverse) association between the CEO tenure (CEO age) and the likelihood of banks' FinTech acquisitions. Specifically, an increase of one standard deviation in CEO tenure (CEO age) increases (decreases) the probability to acquire a FinTech firm by approximately 5.7% (23%). A CEO in his/her role for a long time may have better knowledge and/or be able to exercise more power in the decision-making process (Harford and Li, 2007). Younger CEOs may be more likely to acquire FinTech companies driven by stronger career-related incentives or the aim to be positively distinguished from their older peers (Prendergast and Stole, 1996; Acemoglu et al., 2014; Yim, 2013; Serfling, 2014). For board-specific characteristics, we find that banks with a greater female presence are more likely to pursue FinTech acquisitions. In line with the growing interest in the impact of gender diversity on firm innovation (for instance, Griffin et al., 2021), we document that a decrease by one standard deviation in the percentage of men on the banks' boards increases the probability to acquire a FinTech firm by approximately 19%. Interestingly, we find a significantly positive impact of board nationality diversity only for cross-border acquisitions, and this is most likely due to the nationally diverse board's enhanced knowledge of international markets, regulatory regimes, and broader network contacts (Masulis et al., 2012; Estélyi and Nisar, 2016).

For bank-specific factors, we show that banks with a stronger capital base and a higher degree of liquidity are more likely to acquire FinTech firms. This evidence suggests that a greater share of capital buffers may result in greater bank risk-taking, namely FinTech acquisition (Hannan and Pilloff, 2004; Dell'Ariccia et al., 2011) and that banks can utilize their excess liquidity to pursue expansion via FinTech deals. Specifically, a one-standard-deviation increase of banks' leverage (liquidity) leads to an increase in the likelihood to acquire FinTech by approximately 7.3% (9%). In addition, banks with a higher IT expenditure, which suggest greater in-house development of FinTech solutions, are less likely to target FinTech companies. Additional analysis, also finds that banks with lower IT expenditure have a greater propensity to acquire FinTech companies through multiple acquisitions. Furthermore,

less efficient banks appear more likely to undertake multiple purchases suggesting a stronger motivation to acquire advanced technology to enhance cost efficiency.

Among macroeconomic and institutional factors, banks located in countries with weaker government effectiveness are more likely to acquire FinTech firms in cross-border deals. We contend that a less stringent regulatory framework presents a compelling feature in banks' decision to acquire innovation outside national borders.

Lastly, we test whether our results are driven by banks that are, in general, more engaged in acquisition activity. In other words, FinTech-acquiring banks may merely be the same banks that actively undertake acquisitions even outside the FinTech industry. To address this concern, as a robustness check, we compare the number of non-FinTech acquisitions for each group (FinTech-acquiring and non-acquiring banks), and we confirm the lack of significant difference in the number of non-FinTech deals. Furthermore, we complement our main analysis by employing an alternative group of non-acquiring banks that are matched on the basis of a larger array of bank-specific characteristics. Our findings remain consistent.

The remainder of the paper is structured as follows. Section 2 discusses the relationship between FinTech and traditional banking. Section 3 presents the data and methodology. Section 4 reports the empirical results and robustness tests. Section 5 concludes the paper and discusses the key policy implications.

2. FinTech and Banking

In recent years, the growing importance of FinTech has substantially impacted the banking industry and modern technological innovations, ranging from robotics to Artificial Intelligence (AI) and Machine Learning (ML), are redefining the traditional way of doing banking business. Increasing is the pressure to become more digital in order to address growing sophisticated financial needs and to face competition from both external (non-banks) and internal (neo-banks) market operators that are better equipped to leverage technology. The potential for FinTech firms to offer cheaper and more tailored bank-like products to both individuals and corporates is posing a serious threat to traditional banks' activity, with implications in terms of overall financial stability. The current position of incumbent banks is challenged especially in terms of market share, margins, and customer base, thereby creating the need for traditional banks to develop adequate strategic responses. While part of the ongoing debate underlines the disruptive character of FinTech, beneficial effects in terms of growing competition are also relevant.

¹² Neo-banks are digital financial firms that extensively use technology to provide retail banking services, mainly through smartphones and internet-based platforms. Successful examples of neo-banks are Atom and Monzo in the UK, N-26 in Germany, Webank in China, Simple and Varo Money in the U.S, KakaoBank in South Korea.

¹³ As per Stulz (2019, p.86), the "typical FinTech company is a specialised firm that challenges a specific product line of banks". In contrast, BigTech companies, such as Alibaba, Amazon, Apple or Google, are large and established technological platforms in the market for digital services, not only limited to financial services.

In this respect, timely adoption of technological innovations allows incumbents to gain an advantage relative to competitors while reducing the costs of intermediation and widening access to finance. The tension between stability and competition also fuels the heated discussion on FinTech and how to regulate it (<u>Barba Navaretti et al.</u>, 2017).

The relationship between FinTech and banking is still evolving and under scrutiny by regulators, academics, and practitioners. However, clear is the urgency for the banking industry, which for a long time has remained largely untouched by external disruptive forces, to invest in digital technologies and comprehensively adapt to the modern digital age. The necessity to meet fast-changing consumer behaviors, attract new (tech-savvy) clients and maximize the existing customer base represent fundamental objectives, which assume even greater relevance in a context characterized by exceptionally low-interest rates that compress bank margins and profitability. Banks can undertake multiple approaches in order to engage with FinTech, depending on the established outcome, as well as the specific characteristics and cultures of the organizations. Among various options, which range from alliances to in-house development of new digital technologies, incumbents can acquire FinTech companies. The acquisition strategy ensures an exclusive relationship with the target, which is not achieved in the case of partial investments or other collaborative frameworks. Second, the acquisition of a FinTech firm allows traditional banks to reach, at a relatively low cost, new customers, and also can facilitate cross-selling opportunities. Rapidly accessing new markets is another positive outcome. Finally, the acquisition of a specialized FinTech firm allows banks to overcome the lack of in-house talent and expertise in new digital areas, and also entails advantages in terms of data and security protection, so that confidential information is not handled by third parties.

FinTech innovations mainly regard three product segments directly related to core banking functions (namely; payments, clearing and settlement services; credit, deposit and capital-raising services; and investment management services), as well as more general market support services (such as Blockchain and AI technologies), not specific to the banking industry. Based on a 2018 survey by the BCBS, the greatest share (41%) of FinTech firms operate in the area of digital payments, followed by those in the category of "credit, deposits, and capital raising services" (18%) and specializing into "investment management services" (9%). The widespread use of smartphones and mobile internet has driven the development and provision of new innovative payment solutions, especially in the retail segment. New market players compete with incumbent banks by offering a growing number of user-friendly and accessible payment methods, including "mobile wallets" and innovative point-of-sale (POS) payment services, which are of particular interest to younger generations (millennials).¹⁵ Peer-to-peer (P2P) arrangements, that directly link payers and payees and leverage distributed ledger technology (DLT), are making payments more

¹⁴ In addition, in order to access technology, banks can lead and/or participate as FinTech accelerators, incubators and training programmes.

¹⁵ In some regions, the increasing competition between non-bank firms and banks in payment services has been also promoted by the phenomenon of "Open Banking", which has led banks to open up information on their customers to third parties.

convenient, instantaneous, and available 24/7 (<u>Carstens, 2020</u>). The potential of new technology is also extending the options for cross-border, as well as wholesale payments. Cryptocurrencies, as opposed to fiat (standard) currencies, also represent a disruptive innovation within the fast-changing landscape of payments (<u>Thakor, 2020</u>).

FinTech credit (P2P/marketplace lending), facilitated by digital platforms and without bank intermediation, represents an alternative source of funding for both businesses and individuals (Claessens et al., 2018). Buchak et al. (2018), with reference to the U.S. residential mortgage market during 2007-2015, discuss the rapid increase (from 10% to 25%) in online FinTech lenders' share. In a related study, Fuster et al. (2019) find that FinTech lenders are faster than traditional banks in processing mortgages, without necessarily assuming a higher risk. As per Tang (2019), P2P lending complements bank lending in the case of small loans and credit expansion (associated with FinTech activity) and is likely to be limited to borrowers who already access traditional bank lending. Cornelli et al. (2020) in examining the development of alternative FinTech and BigTech credit worldwide, argue that these other forms of credit complement rather than substitute more traditional channels of credit. Thakor (2020) argues that established banks will not be replaced by P2P lenders, but predicts that the latter will contribute to making the credit market more competitive, potentially enhancing the efficiency of financial intermediation. Thus, in order to avoid significant loss in lending volumes, traditional banks will either have to (i) build their own platforms; (ii) acquire platforms; and/or (iii) partner with existing platforms. If FinTech operators benefit from the lower cost of search and verification, economies of scale in dealing with large amounts of data, and more secure transmissions of information, incumbent banks retain some key competitive advantages (for instance, in liquidity management services).

Connected to the multi-product nature of banking, established banks offer a wide range of bundled services and activities (for example, deposits, payment services, loans) to a consolidated large customer base, which enables the exploitation of powerful economies of scope (Barba Navaretti et al., 2017). Moreover, banks' funding costs are likely to be cheaper thanks to their convenient access to deposits and the presence of explicit and implicit public guarantees (Vives, 2017). In this context, difficulties for online lending platforms to raise funds, especially during crisis times, could create an incentive for these innovative operators to sell themselves to banks, who in turn are keen to acquire digital advanced technologies (Financial Times, 2020). Finally, the relatively light regulatory environment under which FinTech companies operate may become eroded as they become larger and start to resemble established banks. In this respect, FinTech firms' competitive advantage (and consequently lower costs) will diminish, and potential problems in dealing with more complex and burdensome regulation could arise (Barba Navaretti et al., 2017).

¹⁶ In order to fund their lending activity, online platforms rely on credit markets and/or individual investors, who could significantly cut down their investments, especially during highly distressed periods, such as the current pandemic situation.

3. Empirical research design

3.1. Data and sample construction

A significant part of our study is represented by the collection and preparation of the dataset. To address our research questions, and increase data availability and flexibility, we construct a unique dataset based on multiple sources. Data on bank acquisitions are collected from S&P Global Market Intelligence (hereafter "S&P"). We only retain data for deals that are fully completed at the time of our data collection and whose target industry type is classified as "Financial Technology" by S&P. Based on their specialization, S&P classifies FinTech firms into nine sub-categories: (i) Banking Technology; (ii) Business Process Outsourcing; (iii) Digital Lending; (iv) Financial Media & Data Solution; (v) Human Resources & Payroll Technology; (vi) Insurance & Healthcare Technology; (vii) Investment & Capital Markets Technology; (viii) Payments; and (ix) Security Technology. Deals involving firms active in these categories qualify for our dataset.

[Insert Table 1 here]

Table 1 reports the distributions by country and by FinTech specialization of the acquisitions included in our study. FinTech firms specializing in "Payments" represent the most attractive targets for bank acquisitions, accounting for nearly 40% of the overall sample. Acquisitions of payment-specializing FinTech firms are also fairly equally spread across countries. In addition, while FinTech companies specializing in "Investment & Capital Markets Technology" represent a substantial portion of the total number of acquisitions in our sample (20%), they are predominantly targeted by U.S. banks. As in Pasiouras et al. (2007) and Beccalli and Frantz (2013), we only select acquisitions performed by bank-holding companies and commercial banks, in order to avoid the comparison among entities with significantly different business models. The average size of the deal is \$207 million and the majority of the considered banks acquired 100% of the FinTech target's equity.

Our final sample consists of 105 international FinTech acquisitions made by 80 banks in 15 OECD countries during the period 2010-2018.¹⁷ The limited size of the sample is primarily a feature of the focus of our research on a specific sub-category of banks' acquisitions, that gradually grew in importance over the last decade.¹⁸ Moreover, we concentrate on a relatively stringent definition of "FinTech", therefore leaving out acquisitions of targets active

¹⁷ Table 1 in the Online Appendix reports the distribution over time of the FinTech and non-FinTech acquisitions undertaken by the banks in our sample.

¹⁸ However, our sample size is comparable to that of previous studies that consider standard banks' acquisitions over more extended sample periods. For instance, Minnick et al. (2011) examine the impact of CEO compensation on banks' acquisition decisions utilising 159 deals during 1997-2005. Hagendorff and Vallascas (2011), in order to explore the relation between CEO pay incentives and bank risk-taking, employ a sample of 172 acquisitions during 1993-2007.

in related sectors (for instance, information technology), but not applied to finance. Table 2 details the multiple steps undertaken in order to filter our data and construct the sample.

Our study requires additional data. We need a counterfactual and therefore relevant information on FinTechnon-acquiring banks. For this purpose, over the period 2010-2018, we identify 7,755 FinTech-non-acquiring banks in S&P, i.e. 77,500 bank-level observations. The number of FinTech-acquiring banks is fairly small compared to the number of FinTech-non-acquiring banks. According to Palepu (1986), when in prediction studies the number of acquiring firms is skewed in favour of non-acquiring firms, a matched sample is preferable over a random sample as the information content of the former is greater than the latter. This leads to relatively more accurate parameter estimates (Cosslett, 1981; Imbens, 1992). Indeed, Manski and Lerman (1977) and Manski and McFadden (1981) demonstrate that matched samples yield more efficient estimates compared to random samples of the same size. Several studies employ matching techniques to investigate the likelihood of acquisitions or bankruptcy (Hasbrouck, 1985; Charitou et al., 2004; Pasiouras and Gaganis, 2007; Pasiouras et al., 2007). We, therefore, follow the common approach of matching acquiring banks with non-acquiring banks based on bank size and country of location (Brook et al., 2000; Pasiouras et al., 2007). Specifically, in order to obtain a group of non-acquiring banks with a comparable size to those FinTech-acquiring, per country of location, we match the two samples based on a propensity score matching (PSM) approach. Similar to Boubakri et al. (2021), we employ a matching with no replacement, so that non-acquiring banks can only be used once in the matching procedure.

[Insert Table 2 here]

For both groups, FinTech acquiring and non-acquiring banks, we also gather a comprehensive set of governance- and firm-level characteristics. For the CEO- and board-specific variables, the data are hand-collected from banks' annual reports and cross-checked with information from BoardEx. Bank-specific variables are obtained from Moody's Bank Analytics (Bureau van Dijk), which provides standardized accounting information expressed in a common currency, therefore levelling differences in cross-country reporting and accounting conventions. Lastly, we retrieve key macroeconomic and institutional measures from the World Bank database.

3.2. Regression model and selected variables

This paper investigates whether governance, bank-specific financial features, and country-level factors influence the *ex-ante* probability of acquiring a FinTech firm. In line with prior literature on M&As, we rely on a

¹⁹ Specifically, the counterfactual is created via a logit model and we apply one-to-one nearest neighbour, imposing a tolerance level on the maximum propensity score distance (*caliper*) between acquiring and non-acquiring banks equal to 0.01 (Dehejia and Wahba, 2002; Anderson et al., 2017). As evident from Table A2 in Appendix A, following the PSM, the size difference between the FinTech-acquiring banks and the matched FinTech-non-acquiring banks is not statistically significant, with a 0.99 p-value. Figure A1 in Appendix A reinforces the evidence that the matching exercise has produced two groups of banks of comparable size, with no significant differences.

probit model to assess the determining factors of banks' acquisitions of Fintech firms (<u>Cummins and Xie, 2008</u>; <u>Elnahas and Kim, 2017</u>).²⁰ Specifically, we estimate the following regression model:

$$Pr[Y_{it} = 1 \mid X_{ijt}, Z_{ijt-1}] = \delta (X_{ijt}^{'}\beta + Z_{ijt-1}^{'}\phi + \gamma_t + \varepsilon_{it})$$
(1)

where Y is a dummy variable describing the acquisition status. Y=1 if a bank has acquired a FinTech firm in a given year, and Y=0 otherwise. X_{ijt} is a vector of CEO and board characteristics that we employ to gauge a bank's probability to acquire a FinTech firm. Z_{ijt} is a vector of bank-specific and macroeconomic/institutional factors. All variables in vector Z refer to the year prior to the acquisition. 21 i=1,2,...N indicates banks, t=1, 2...T labels the year and j=1, 2...N the countries. All model specifications include year fixed-effects (N _D) to control for global conditions and common shocks. 22

For X_{ijt} in Eq. (1), we consider a variety of CEO and board characteristics as possible key drivers of banks' acquisition of FinTech. Based on prior literature, we expect CEO characteristics to be relevant for the decision to acquire. Harris and Raviv (2005) argue that the acquisition decision is not delegated to lower-level managers and Graham et al. (2015) report that the CEO is the dominant decision-maker in M&As. Cain and McKeon (2016) find evidence of a significant association between the CEO's (personal) risk-taking, measured by the CEO's pilot license, and acquisition activity. They also document a positive link between CEO's tenure and acquisition decisions. The existing literature consistently provides evidence of the significance of board characteristics on corporate governance and corporate policies. For instance, Berger et al. (2014) document a significant relationship between the demographic characteristics of executive boards and banks' risk-taking.

CEO age. We employ CEO age (CEO_age) to assess whether this is a predictor of banks' acquisition behavior. We predict an inverse relationship between the age of a CEO and the probability of acquiring a FinTech firm, for three reasons. First, as suggested by Yim (2013), younger CEOs face stronger incentives to acquire a FinTech firm as they have longer career horizons. Moreover, younger CEOs are more overconfident which, ultimately, leads to a higher number of acquisitions at the early stages of their careers. Second, younger CEOs are more open to radical innovation and, consequently, should be more prone to shift bank innovation strategy to pursue FinTech acquisitions (Acemoglu et al., 2014). Lastly, the literature suggests that younger CEOs tend to make bolder and riskier investments as a way to be distinguished from older CEOs and signal to the market their superiority (Prendergast

²⁰ In a robustness test, reported in the Online Appendix, we also perform our main analysis by using a *logit* regression model. Results are consistent.

²¹ Refer to Table A1 in Appendix A for details on the way the selected variables are constructed.

²² We consider a comprehensive set of factors to minimize potential omitted variable bias. In order to avoid potential multicollinearity issues, we perform a correlation analysis, for which the results are reported in Table A3 in Appendix A, and calculated the variance inflation factor, which is found to be 1.40.

and Stole, 1996; Serfling, 2014). In our research setting, this evidence may be reflected in a higher propensity of younger CEOs to acquire FinTech companies.

CEO duality. Following Hagendorff et al. (2010) and Hagendorff and Vallascas (2011), we consider whether the CEO also serves as chairman of the board, as a proxy for CEO power and control over the board (CEO_duality). In particular, we include a dummy variable which is equal to one if a CEO is also the chair of the board and zero otherwise. Based on prior evidence, the effect of CEO duality on the likelihood of acquisition can be mixed. Masulis et al. (2007) suggest that the separation between the CEO and chairman of the board results in higher-quality acquisitions. In contrast, CEO duality may entail a clearer direction from a single leader and therefore a faster and more effective decision-making process (Boyd, 1995). In this respect, we can expect the dual position of a CEO to be better able to exercise a strong influence on the board, thereby pushing towards FinTech acquisitions.

CEO tenure. Following Ozkan (2012) and Berger et al. (2014), we include CEO tenure (CEO_tenure), measured as the number of years since becoming the CEO of the bank. The effect of CEO experience on FinTech acquisitions is not clear-cut. On the one hand, the longer the CEO has been in control of the bank, the more he/she should know about the bank's capabilities and prospects. On the other hand, a relatively new CEO may be more likely to follow a more innovative acquisition strategy (Akhavein et al., 2005). Moreover, based on Harford and Li (2007), CEO tenure can also be a proxy for CEO power. Therefore, if a powerful CEO is more likely to undertake risky acquisitions, there may be a positive relationship between CEO tenure and the propensity to acquire FinTech.

Foreign CEO. We account for the nationality of CEOs by employing a dummy variable (*CEO_foreigner*), which assumes the value of one if a CEO's nationality is different from where the bank is headquartered and zero otherwise. A foreign CEO may positively influence bank acquisition activity, given greater international experience and knowledge. Nevertheless, a CEO's foreign experience does not necessarily imply superior managerial ability (Conyon et al., 2019).

CEO education. Educational background can be another relevant force behind a CEO's decision-making. More educated CEOs may have greater cognitive complexity and this can suggest a stronger aptitude to take on new ideas and technological innovations (Barker and Mueller, 2002). King et al. (2016) find that CEOs with MBAs increase bank performance by undertaking riskier or more innovative business models. In relation to corporate risk-taking, Farag and Mallin (2018) find a positive relationship between CEO education and corporate risk-taking. To investigate this aspect, we construct a dummy variable (CEO_education) which equals one if a CEO has a doctoral degree, and zero otherwise.

Board size. We use board size (*Board_size*) measured as the number of directors elected to the board (<u>Cornett et al. 2003</u>; <u>Dahya et al., 2019</u>). The relationship between board size and FinTech acquisition is not clear a priori. On the one hand, a larger board size may enrich the pool of available knowledge (<u>Hagendorff et al., 2010</u>), thereby

improving the assessment of suitable targets for acquisitions. On the other hand, larger boards have the potential to be environments where a lack of communication and coordination prevails (Jensen, 1993; Yermack, 1996; Giannetti and Zhao, 2019). This, in turn, may affect the capability of the board to undertake effective decisions regarding acquisitions.

Board gender diversity. We measure gender diversity in the banks' boardroom (Gender_diversity) as the fraction of male directors over the total number of board members (Levi et al., 2014). In line with previous findings in the literature, we anticipate that the influence of board gender diversity on the decision to acquire FinTech can be mixed, both positive and negative. Women can be less risk-taking (Byrnes et al., 1999; Barber and Odean, 2001) and less overconfident (Knight, 2002) than men, and thus a female-predominant board may be slower to innovate via FinTech acquisition. Levi et al. (2014) and Chen et al. (2016) also document that a higher female board representation significantly reduces the likelihood to acquire. By contrast, Sapienza et al. (2009) find that women who are in the financial industry are less risk-averse than women in other industries. Adams and Funk (2012) show that women are more risk-loving than men and conclude that having a female director on the board need not lead to more risk-averse decisions. Berger et al. (2014) find that boards with a higher proportion of female executives tend to assume higher risk. Therefore, it is reasonable to expect that a larger fraction of female directors could positively contribute to the probability of acquisitions. Moreover, given that female directors are likely to improve board managerial skills (Zelechowski and Bilimoria, 2004), boards that are more diversified are likely to be better equipped to identify the benefits of FinTech acquisitions.

Board nationality diversity. In addition to board gender diversity, in line with existing literature (Levi et al., 2014; García-Meca et al., 2015) we employ the fraction of foreign board members over the total number of members as a measure for board nationality diversity (National_diversity). Boards that are nationality-heterogeneous may exploit diverse functional backgrounds and skill-sets, which in turn can be beneficial when engaging in complex assessments, such as those involving innovation-driven acquisitions (Bantel and Jackson, 1989). Masulis et al. (2012) empirically examine whether firms with foreign independent directors make better cross-border acquisitions, as suggested by Adams et al. (2010). They argue that the international expertise of foreign directors positively contributes to cross-border acquisitions. In addition, board diversity has the potential to expand board members' networks. This, in turn, may support banks in accessing capital for acquisitions, enlarging contacts with business elites and bank regulators, which may result in a competitive advantage (Richard, 2000). We expect a positive impact of board nationality diversity on the banks' propensity to acquire FinTech firms, especially in cross-border deals.

For Z_{ijt-1} in Eq. (1), we follow previous studies (for instance, <u>Focarelli et al., 2002</u>; <u>Pasiouras et al., 2011</u>) that show the relevance of various bank-level features as driving factors of acquisitions, so we include several bank-

specific variables (namely; equity to total assets; return on assets; cost to income ratio; liquidity; credit risk). Given our specific focus on FinTech acquisitions, we also account for the level of IT expenditure to account for potential in-house development of new digital solutions. In particular, we believe that the inclusion of this specific variable can help mitigate a potential bias caused by omitting relevant factors that could affect the decision to acquire FinTech as discussed in Section 2. Finally, relative to the country where the acquiring banks are located, we include macro- and institutional-level variables, such as (i) Gross Domestic Product (GDP) growth; (ii) government effectiveness; (iii) and the number of branches to 100,000 adults. All variables in vector *Z* refer to the year prior to the acquisition of FinTech-acquiring banks.

Equity to total assets. As in Hannan and Rhoades (1987) and Beccalli and Frantz (2013), we employ the equity to total assets ratio (*E/TA*) as a measure of bank capitalization. The effect of bank capital on the probability to engage in acquisitions, especially in FinTech, is not clear a priori. On the one hand, under the "excessive regulatory capital" hypothesis (Hannan and Pilloff, 2004), banks that hold capital in excess of the regulatory requirements face a greater opportunity cost and may employ the extra capital for acquisition activities. Moreover, a larger capital buffer can entail greater bank risk-taking (Dell'Ariccia et al., 2014), and hence an increasing propensity to FinTech acquisitions. In this case, we expect a positive relationship between the level of bank capital and the probability of acquiring a FinTech firm. On the other hand, less capitalized banks with "less skin-in-the-game" (De Nicolò et al., 2010; Jiménez et al., 2014), may be prone to assume extra risk via FinTech acquisitions in the attempt of gambling for resurrection. In addition, to the extent that capital is an indicator of bank managerial efficiency, there could be an inverse relationship between *E/TA* and our dependent variable, given that banks with skillful managers are able to successfully operate with higher leverage.

Return on assets. As in Wheelock and Wilson (2000) and Focarelli et al. (2002), we employ the return on assets (ROA) to check whether profitable banks are more or less likely to engage in FinTech acquisitions. As for bank capitalization, the effect of bank profits on the *ex-ante* probability of acquiring a FinTech firm is not straightforward. For instance, we expect profitability to be positively associated with FinTech acquisition, given that more profitable banks may dispose of more resources to be channelled to acquisitions. However, there may be an inverse relationship as less profitable banks can engineer ways to boost bank profits via high-tech-driven acquisitions. In addition, recent studies (Molyneux et al., 2019; Molyneux et al., 2020) have shown that low interest rates, especially when prolonged, compress bank margins and profitability. This pushes banks to find alternative ways to support profits in low interest rate environments. Since our sample period covers a period of generally low interest rates worldwide, this may result in a negative link between profitability and FinTech acquisition.

Cost to income. In line with the extant literature (<u>Focarelli et al., 2002</u>; <u>Molyneux, 2003</u>; <u>Pasiouras and Gaganis</u>, 2007; <u>Hernando et al., 2009</u>; amongst others), we employ the cost to income ratio (*Cost_to_income*), defined as the

operating cost that is necessary to generate one unit of income. We expect a negative relationship with our dependent variable, as efficient banks (with a lower cost to income ratio) are more likely to stay competitive by looking for innovative options to cut costs and improve expense management. In this regard, as highlighted in <u>Vives (2017)</u> and <u>BCBS (2018)</u>, FinTech provides advanced technologies that can effectively enhance bank efficiency. However, since the banking industry is rather inefficient relative to other economic sectors (<u>Philippon, 2019</u>), less efficient banks may exploit FinTech acquisitions to improve their condition. Moreover, as shown by <u>Andreeva et al. (2019)</u>, banks with profitability issues have generally high cost to income ratios. Hence, a positive relationship may be revealed if innovation-driven acquisitions could help high cost to income ratio banks reduce their costs.

Liquidity. Following <u>Pasiouras et al. (2011)</u>, we use the ratio of liquid assets to customers and short-term funding as a measure of bank liquidity (*Liquidity*). We expect a positive relationship between bank liquidity and the probability to acquire a FinTech firm, given that more liquid banks can employ the excess liquidity to pursue profitable acquisition opportunities.

Credit risk. We include the ratio of non-performing loans to gross loans (*NPLs*), as a measure of ex-post credit risk. We predict a positive relationship between *NPLs* and the probability to acquire a FinTech firm given that advances in digital technology improve monitoring and screening functions thanks to the enhanced ability to collect, process, and store information (<u>Liberti and Petersen</u>, 2019; <u>Pierri and Timmer</u>, 2020). However, high levels of *NPLs* act as a drag on bank capital resources, and this may reduce the potential for acquisition.

IT expenditure. To account for banks' in-house development of new digital solutions, we include the ratio of information technology (IT) expenditure to operating expenses (*IT_expenditure*). Banks with large and well-established IT departments tend to develop proprietary IT systems and technologies (<u>Alt et al., 2018</u>). Accordingly, we expect an inverse association between *IT_expenditure* and banks' propensity to acquire FinTech.

GDP growth. In line with Rossi and Volpin (2004), we employ the growth rate of nominal GDP (*GDP_growth*) as investment decisions made by banks may be affected by overall economic conditions. For instance, banks may be more likely to acquire FinTech companies if located in countries experiencing economic booms.

Government effectiveness. In line with prior studies (Beltratti and Paladino, 2013; Deng and Yang, 2015), we include a World Bank government effectiveness indicator (Gov_effectiveness) that reflects perceptions of the quality of (i) public services; (ii) civil service and its independence from political pressure; (iii) policy formulation and implementation; and (iv) credibility of the government's commitment to these policies. More or less stringent regulations and policies can influence banks' decisions to seek acquisition opportunities, including deals in the FinTech sphere.

Number of bank branches. Finally, we employ the number of bank branches per hundred thousand individuals (*N.branches*) as a proxy for the traditional bank business model (<u>Chiorazzo et al., 2018</u>). The influence of this

indicator on banks' propensity to acquire FinTech is not clear a priori. We expect an inverse relationship if physical branches remain central to the prevalent bank business model, as means to build long-lasting relationships based on frequent personal interactions. In this sense, there may be a reduced incentive for digital innovation. A positive association may also be expected as banks with substantial branches may be able to realize greater synergies through linking acquired FinTech firms with existing infrastructures.

3.3. Descriptive statistics

With reference to both the group of FinTech-acquiring and matched non-acquiring banks, Table 3 reports the descriptive statistics for each variable included in the empirical analysis for the entire sample period (2010-2018). In addition, we report the *t*-test for the difference in the means between the two groups.

[Insert Table 3 here]

Panel A of Table 3 refers to the CEO and board characteristics. Our results show that among various CEO characteristics, the *CEO_age* variable demonstrates a significant difference between the two groups. In particular, CEOs of FinTech-acquiring banks are on average 11 years younger than CEOs of non-acquiring banks and this difference is statistically significant. With respect to the board-specific variables, *Board_size* and *Gender_diversity* are significantly different for the two groups. Specifically, it appears that FinTech-acquiring banks tend to have a smaller board size and a greater female presence, compared to non-acquiring banks. The *National_diversity* variable does not appear to be significantly different between the two groups.

Panel B of Table 3 compares the bank-specific characteristics of the two groups. On average, FinTech-acquiring banks tend to be better capitalized (higher *E/TA*) and more profitable (higher *ROA*), with greater liquid assets and lower *NPLs* in comparison to non-acquiring banks. Surprisingly, no significant differences are revealed in terms of *Cost_to_income* or *IT_expenditure*. Lastly, Panel C refers to the macroeconomic and institutional variables. While the difference in government effectiveness is marginally significant, the other two variables (i.e. GDP_growth and N.branches) display more significant differences.

4. Empirical results

4.1. Bank propensity to acquire FinTech

In this section, by using a probit regression (Eq. (1)), we investigate the *ex-ante* driving factors of bank FinTech acquisitions. In Section 3.3, in a univariate setting, we explored the differences between the two groups of FinTech-acquiring and non-acquiring banks. However, central to our analysis is the aim of capturing the simultaneous impact of the selected factors on our dependent variable. We, therefore, proceed by investigating the marginal effects of our variables in a multivariate framework.

[Insert Table 4 here]

Table 4 reports the estimated results. We begin by separately investigating the effects of CEO- and board-specific factors (columns 1 and 2) to then include bank, macroeconomic and institutional variables (columns 3 and 4). The reported results in columns 1 and 3 are without year-fixed effects, while those in columns 2 and 4 account for them. The relatively small differences between models with and without year-fixed effects suggest that our findings are not sensitive to time effects. Model specifications 1 and 2 show that a CEO with a longer tenure is more likely to acquire FinTech companies (the related coefficient is statistically significant at the 1% level). Specifically, an increase by one standard deviation in *CEO_tenure* increases the probability to acquire a FinTech firm by approximately 5.7%.²³ Our results, therefore, indicate that a CEO who has been in his/her role for a longer time may have a better knowledge of the bank-specific possibilities and prospects and/or be able to exercise more power in the decision-making process (Harford and Li, 2007).

We find a negative and statistically significant (at the 1% level) relationship between *CEO_age* and the likelihood to acquire FinTech firms. An increase by one standard deviation in *CEO_age* decreases the probability to acquire a FinTech firm by approximately 23%. As discussed in Section 3.2, younger CEOs may be more likely to acquire FinTech companies driven by stronger career-related incentives or the aim to be positively distinguished from their older peers. We also document a negative and statically significant (at the 1% level) relation between *CEO_foreigner* and propensity to acquire FinTech firms. Foreign CEOs are about 12% less likely to engage in these deals compared to CEOs who are born in the same country where the bank is headquartered. We contend that foreign CEOs might be too culturally distant from the country of the bank's headquarters, lacking the required familiarity with the economic environment. Consequently, it may be harder for foreign CEOs to identify profitable investment opportunities.²⁴

Among the board characteristics, we find that *Gender_diversity* is inversely associated with the propensity towards FinTech acquisition, which is also consistent with the univariate evidence previously discussed. Banks with a larger proportion of female directors are more likely to acquire FinTech firms. Specifically, a decrease by one standard deviation in *Gender_diversity* increases the probability to acquire a FinTech firm by approximately 19% This relationship could be driven by several channels, according to prior literature. Female directors in banks may not be necessarily more risk-averse than male directors (Adams and Funk, 2012; Berger et al., 2014), or female directors may effectively contribute to improving board managerial skills (Zelechowski and Bilimoria, 2004). Therefore, bank boardrooms with more women may be better equipped to identify the benefits of FinTech

²³ The economic magnitude of the results is computed on the basis of the most comprehensive model specification (namely, column 4).

²⁴ However, the CEO's nationality is proven to be relevant in the case of cross-border acquisitions. This aspect will be investigated in Section 4.2.1.

acquisitions and the related shift towards increased digitalization. The presence of foreign directors does not reveal a significant impact on banks' likelihood to acquire FinTech, suggesting a lack of relevance of national diversity in the boardroom.

Results for the most comprehensive model specifications (columns 3 and 4) confirm the relevance of CEO-and board-specific characteristics in explaining banks' propensity to acquire FinTech. The inclusion of additional bank, macroeconomic, and institutional factors does not alter the overall results. The magnitude of coefficients on the CEO- and board-specific variables slightly decrease, but *CEO_tenure*, *CEO_age*, *CEO_foreigner*, and *Gender_diversity* remain highly statistically significant. Moreover, when controlling for year-fixed effects (column 4), the coefficient on *CEO_education* turns statistically significant at the 5% level, suggesting that highly educated CEOs (CEOs with doctoral degrees) are more likely to acquire FinTech companies.

Bank-, macroeconomic- and institutional-specific factors appear to play a significant role in driving FinTech acquisition. For bank-level characteristics, *E/TA* and *Liquidity*, for which we previously find positive and significant differences between the treated and control groups, reveal highly significant results (at the 1% level) in the probit regressions (columns 3 and 4). An increase of one standard deviation in *E/TA* and *Liquidity* increases the bank's probability to acquire a FinTech firm by approximately 7.3% and 9%, respectively. Banks with a stronger capital base and a higher degree of liquidity are more likely to acquire FinTech firms. In this respect, our results appear to be consistent with the "excessive regulatory capital" hypothesis (Hannan and Pilloff, 2004), as well as with the argument that larger capital buffers result in greater bank risk-taking, represented by FinTech acquisitions in our case (De Nicolò et al., 2010). The positive coefficient on the *Liquidity* variable is consistent with our prior expectation that banks with higher liquid resources can use these for acquisition opportunities.

Moreover, the negative impact of *NPLs* becomes statistically significant, at the 5% level, after controlling for year-fixed effects (column 4). As we discussed in Section 3.2, this evidence might be due to the detrimental impact that high ex-post credit risk has on bank capital and consequently on the likelihood to undertake acquisitions. Moreover, this negative impact on acquisition activity becomes more evident after controlling for year-fixed effects possibly due to some market-wide risks that banks might commonly face. Unsurprisingly, we find an inverse association between *IT expenditure* and our dependent variable, whose statistical significance varies depending on the model specification. As discussed in Section 3.2, we include *IT_expenditure* as a measure of a bank's in-house development of FinTech solutions, as an alternative strategy to externally acquire FinTech. Accordingly, the negative coefficient on *IT_expenditure* would suggest that a bank with larger spending on in-house technology is less likely to acquire FinTech companies.

With regard to the macroeconomic and institutional factors, we find a positive relationship with *GDP_growth* and an inverse association with *Gov_effectiveness*. This indicates that banks' investment decisions are related to

overall economic conditions. More specifically, banks located in countries with higher GDP growth and lower government effectiveness are more likely to acquire FinTech firms. Banks experiencing a positive business cycle and upside economic trends might be more prone to engage in acquisitions due to the greater availability of resources. Banks in countries with less stringent regulations and policies appear to seek more acquisition opportunities.

4.2. Additional analyses

In this section, we further exploit the information we have in our acquisition dataset. By means of multiprobit regressions, we, therefore, perform additional analyses on domestic versus cross-border acquisitions and single versus multiple acquisitions. Our econometric identification takes the following form:

$$Pr\left[Y_{it} = k \,\middle|\, X_{ijt}, Z_{ijt-1}\right] = \delta\left(X_{ijt}^{'}\beta + Z_{ijt-1}^{'}\phi + \gamma_{t} + \epsilon_{it}\right) \qquad k = 0, 1, 2 \tag{2}$$

where Y=0 indicates FinTech-non-acquiring banks. Y=1 refers to banks that acquire a domestic (single) FinTech firm in a given year, whilst Y=2 indicates banks that engage in cross-border (multiple) FinTech acquisitions. The corporate governance, bank- and country-specific characteristics employed in Eq. (2) are the same as in Eq. (1).

4.2.1. Domestic versus cross-border acquisitions

Cross-border acquisitions, as opposed to domestic deals, may entail more challenges due to differences in culture, regulation, or legal systems (Mantecon, 2009). Institutional and cultural values might be unfamiliar to the acquirer and differences might exist in terms of accounting practices and/or disclosure requirements, as well as the legal environment. The greater degree of uncertainty and information asymmetry involved in cross-border acquisitions can thus lower the value of the exchanged assets and explain the underperformance of buyers in these deals (Andrade et al., 2001; Denis et al., 2002). On the other hand, the acquisition of foreign assets can represent a significant opportunity for the acquirer in terms of improved risk management, enhanced technology and conducive government policies (Moeller and Schlingemann, 2005). Therefore, although domestic and cross-border acquisitions conceptually occur for the same reason, namely the increased value and/or utility from the perspective of the acquiring firm, deals across national borders might present specific peculiarities (Erel et al., 2012). As a result, the ex-ante drivers of domestic and cross-border acquisitions may be different. While prior contributions have focused on (i) the differences between domestic and cross-border bank acquisitions (Altunbaş and Marqués, 2008; Hernando et al., 2009); (ii) the drivers of cross-border deals (Focarelli and Pozzolo, 2001; Molyneux, 2003; Gulamhussen et al., 2016); and (iii) the impediments to international acquisitions (Buch and DeLong, 2004), there exists a void in the literature on the potential difference between the determining factors of banks' FinTech acquisitions within and across countries.

Among our selected driving factors, we expect the two nationality-related variables, *CEO_foreigner* and *National_diversity*, to display substantial differences between domestic and cross-border acquisitions. We predict *CEO_foreigner* to be especially relevant for cross-border acquisitions, given the enhanced foreign knowledge and international networks of foreign CEOs (Estélyi and Nisar, 2016). With a similar underlying explanation, we also expect that *National_diversity*, at the board level, plays a more prominent role in the case of cross-border deals. As argued by Masulis et al. (2012), who empirically examine whether firms with foreign directors make better cross-border acquisitions, we expect that the international expertise of foreign directors is more likely to result in cross-border acquisitions, including FinTech deals.

Focarelli and Pozzolo (2001), as well as Buch and DeLong (2004), highlight the significance of the regulatory landscape for cross-border bank M&As, attaching a pivotal role to national governments and regulation, especially, in cross-border deals. In our setting we, therefore, expect *Gov_effectiveness* to be a relevant factor in driving banks' cross-border acquisitions. On the one hand, we expect banks in countries with a higher *Gov_effectiveness* are more likely to target domestic FinTech companies to be benefited from the effectiveness of the domestic government. On the other hand, the lack of national government effectiveness may push banks to acquire FinTech firms cross-border to gain from greater regulatory effectiveness. We also include *N.branches* as the prevailing bank business model of the country where banks operate would also affect their acquisition strategy towards FinTech players with the aim of advancing their digital transformation.

[Insert Table 5 here]

Table 5 presents how *CEO_foreigner*, *National_diversity*, *Gov_effectiveness*, and *N.branches* are associated with domestic (column 1) and cross-border (column 2) acquisitions. Overall, the results are consistent with our expectations. A foreign CEO appears to be less likely to acquire a FinTech company within the same country where the bank is located, but more prone to acquire one in a different country (although only the coefficient in column 1 is statistically significant). For *National_diversity*, we document a positive and statistically significant (at the 5% level) relationship in the case of cross-border acquisitions and an inverse association in the case of domestic deals.

The results for country-level variables also provide interesting insights. We document a significantly negative impact of *Gov_effectiveness* only for cross-border acquisitions (column 2). This evidence supports our expectation that banks located in countries with a lower *Gov_effectiveness* are more likely to target FinTech firms outside national borders. In the case of *N.branches*, findings are lacking statistical significance both for domestic and cross-border acquisitions.

²⁵ As for the main regressions presented in Section 4.1, we include all our selected variables. However, in the interests of brevity, in the current section, we report and discuss only the results for the variables that are central to our additional analyses.

4.2.2. Single versus multiple acquisitions

Furthermore, we test whether the *ex-ante* driving factors differ between single and multiple FinTech acquisitions. Ahern (2008) documents that "serial acquirers" are the norm and not the exception. In particular, the author finds that only 38% of M&A deals from 1980 to 2004 are undertaken by first-time acquirers. In our sample, we have 65 single acquisitions and 42 multiple deals. ²⁶ The rationale for a firm to engage in multiple acquisitions is still unclear and central to an ongoing debate in the finance literature (Aktas et al., 2009). In this respect, the motives for multiple FinTech deals remain unexplored and it is therefore challenging to develop a priori expectations. However, considering consistent evidence provided in the relevant literature on the positive relation between CEO overconfidence and acquiring behavior (Malmendier and Tate, 2008; Aktas et al., 2009), we anticipate that an overconfident and/or powerful CEO would be more likely to undertake multiple acquisitions. Among the selected CEO characteristics, we, therefore, expect a specific relevance of CEO age and duality in the case of multiple FinTech acquisitions. Younger CEOs are potentially also more open to radical innovation and thus aggressively undertake FinTech acquisitions (Acemoglu et al., 2014). In addition, the higher overconfidence associated with younger CEOs may play a relevant role (Billet and Qian, 2008). With regard to CEO_duality, we expect that this contributes to the bank's likelihood to acquire multiple times due to faster and more effective decision-making stemming from a single leader (Boyd, 1995).

A priori, we also expect two bank-specific factors to be relevant drivers for multiple FinTech acquisitions. First, we believe that less efficient banks (with a lower *Cost_to_income*) are more likely to be multiple acquirers in order to enhance efficiency by adopting advanced technology (<u>Vives, 2017</u>). Second, we expect banks with a higher *IT_expenditure* to engage less in multiple acquisitions, given that they internally invest to develop new digital solutions and therefore have less incentive to make multiple FinTech acquisitions.

[Insert Table 6 here]

Table 6 presents the results for our key variables in this additional test, for both single (column 1) and multiple (column 2) acquisitions. Our findings indicate that the age of the CEO maintains its relevance also in the case of multiple deals. A younger CEO is more likely to acquire more than once, as suggested by the negative and statistically significant (at the 1% level) coefficient in column 2. Furthermore, the duality characteristic appears to assume relevance in the case of multiple deals, thereby suggesting that a CEO who also serves as chairman of the board is more likely to engage in more than one FinTech acquisition.

²⁶ In particular, 65 banks engage in a single acquisition whilst 15 banks engage in multiple acquisitions. On average, banks acquire 1.33 FinTech companies over the sample period. Five is the highest number of acquisitions undertaken by a single bank.

For bank-specific factors, we find that banks that are less efficient (with a higher *Cost_to_income*) and have a lower *IT_expenditure* are more likely to be multiple acquirers. Less efficient banks appear to be more aggressive in acquiring FinTech companies in order to achieve cost efficiency gains via the adoption of new technology. As discussed in Section 3.2, and in line with the results for our main regressions, an inverse and significant (at the 5% level) relationship is documented between *IT_expenditure* and the propensity to engage in multiple FinTech acquisitions.

4.3. Robustness checks

In the previous sections, we highlight the main ex-ante factors driving banks' FinTech acquisitions. However, although our main focus is on FinTech deals, it is possible that banks that are more likely to undertake acquisitions, in general, also undertake FinTech acquisitions. For instance, we document that banks' capital and liquidity are positively related to the propensity to acquire FinTech companies. Given that banks with higher capital and liquid assets can use these to exploit acquisition opportunities, it can be argued that our results are driven by high capital and liquid banks that are more likely to engage in acquisitions, regardless of whether the target is a FinTech company or not. To address this concern, we conduct two analyses. First, we compare the number of non-FinTech acquisitions of the two groups (FinTech-acquiring and non-acquiring banks). If the FinTech-acquiring incumbents are banks that, in general, are more active in the acquisition sphere, then we should expect these banks to have a significantly higher number of non-FinTech acquisitions.

[Insert Table 7 here]

Table 7 reports the number of non-FinTech acquisitions undertaken by the FinTech-acquiring and non-acquiring banks. On average, during the same sample period, the two groups acquire a similar number of non-FinTech firms (1.76 and 1.89, respectively), and the corresponding mean difference is lacking statistical significance. This test addresses the potential concern that FinTech-acquiring banks are merely more engaged in acquisition activity, not just limited to FinTech.

Next, we build an alternative group of FinTech-non-acquiring banks using a different matching procedure and examine whether our main findings are confirmed. While our original matching strategy is based on bank size and country of location, here we include additional bank-specific characteristics that would be related to the acquisition activity of banks. In particular, we consider *E/TA*, *ROA*, *Cost_to_income*, *Liquidity*, and *NPLs* and obtain a matched group of FinTech-non-acquiring banks, with very similar balance-sheet characteristics.²⁷ In this setting, therefore,

²⁷ As for our main matching strategy, we apply one-to-one nearest neighbor with no replacement and impose a tolerance level on the maximum propensity score distance (*caliper*) between the treatment and the control group equal to 0.01. Based on this alternative procedure, we match fewer (89) observations.

our focus is solely on the role of corporate governance factors as potential driving forces behind banks' propensity to acquire FinTech.

[Insert Table 8 here]

Table 8 presents the estimated results of Eq. (1) using the alternative matching strategy. Given that the main bank-specific factors are employed in the matching criteria, they are excluded from the probit model. In Table 8, columns 1 and 2 report the results for CEO- and board-level characteristics, without and with year-fixed effects, respectively. Overall, our main findings are generally consistent also when employing an alternative and more parsimonious matching strategy. In particular, among the CEO characteristics, albeit a marginal change in terms of statistical significance, we document positive effects of *CEO_tenure* and *CEO_education* and inverse relations of *CEO_age*. Under this alternative matching exercise, and compared to our main findings, the coefficient on *CEO_foreigner* turns insignificant, while the positive relationship with *CEO_duality* gains some statistical significance.

More robust results are shown for board characteristics. For instance, the impact of *Gender_diversity* is highly statistically significant (at the 1% level), once again suggesting the relevance of a greater presence of women drives FinTech acquisitions and therefore innovation. *Board_size*, which was lacking statistical significance in our main regressions, here assumes an inverse relation with the banks' propensity to acquire, which is marginally significant at the 10% level, in both model specifications. *National_diversity* in the boardroom, which appeared to be a relevant driver for cross-border acquisitions, here reveals an inverse relationship with the banks' likelihood to acquire FinTech. The corresponding statistically significant coefficients suggest that a wider nationality diversity may not necessarily improve boards' efficacy (Anderson et al., 2011), thereby holding back banks' decision to engage in FinTech deals.

In a further robustness test, we examine whether our results remain consistent even after excluding the acquisitions of less than 100% of the FinTech target's equity. We confirm that there are 28 banks that acquired less than 100% of the target's equity in our sample. In untabulated results, we find that the results are overall aligned to those discussed for the main analysis, lending support to our main findings.

5. Conclusions and policy implications

This paper investigates the *ex-ante* drivers of banks' propensity to acquire FinTech firms. Using hand-collected bank governance and financial information, as well as various economic and institutional variables, our empirical analysis investigates the nuances underlying banks' decisions to acquire FinTech firms. We find that CEO tenure positively influences the decision to make a FinTech acquisition whereas CEO age has an inverse relationship. Bank boards with a greater female presence are also more likely to pursue FinTech acquisitions. The financial

performance of acquirers is also key, as banks with greater capital strength and liquidity are more likely to acquire FinTech firms. Banks with a higher IT expenditure, which may indicate in-house development of advanced digital solutions, are less likely to target FinTech companies. Banks with younger CEOs and lower IT spending are more likely to undertake multiple FinTech acquisitions. A greater nationality diversity in the boardroom appears to be conducive to FinTech cross-border deals.

Our investigation assumes particular relevance in the context where traditional banks are seeking to maintain their customer base, improve their efficiency, and adapt to the new digital era. The adoption of advanced technology can liberate resources otherwise constrained and support a re-focus on core activities where banks are better able to leverage their consolidated strengths. In this respect, exploiting the opportunities and flexibility associated with FinTech, by strategically engaging in acquisitions, is an increasingly compelling option for incumbents.

Furthermore, in light of the latest developments worldwide (COVID-19 pandemic), banks' shift towards digitalization has rapidly accelerated in order to meet consumers' increasing preference for online and innovative services. A trend that, most likely, will persist once the pandemic is over. Based on this, understanding the reasons why banks opt to acquire FinTech firms to leverage their advanced technology is of particular interest to both policymakers and academics. At the least, we show that having solvent and more liquid banks, along with other governance and economic/institutional factors, all contribute to explaining banks' expansion into the FinTech business. Future research calls for investigation into the medium and long-term benefits of digital technology adoption in the banking industry, as well as the evolving regulation and supervision of these new business areas.

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Table 1. Sample distribution

This table presents the distribution of the considered sample of FinTech acquisitions by country (rows) and by FinTech specialization (columns). The numbers in parentheses represent the cross-border deals with the country of the acquired FinTech company: AUS (Australia); BEL (Belgium); BRA (Brasil); CAN (Canada); CHE (Switzerland); CZE (Czech Republic); DEU (Germany); GBR (Great Britain); IND (India); IRL (Ireland); ITA (Italy); LUX (Luxembourg); NLD (Netherlands); NOR (Norway); NZL (New Zealand); SVN (Slovenia); USA (United States).

Country	Banking Technology	Business Process Outsourcing	Digital Lending	Financial Media & Data Solution	Human Resources & Payroll Technology	Insurance & Healthcare Technolog y	Investment & Capital Markets Technology	Payments	Security Technology	N. Acquisition	Percentage
Australia				1		<u> </u>		3 (1 NZL)		4(1)	3.80 (4.00)
Austria								1 (1 CZE)		1(1)	0.95 (4.00)
Canada								2 (1 USA)		2 (1)	1.90 (4.00)
France	1						2 (1 ITA)	6 (1 BEL)		9 (2)	8.57 (8.00)
Germany	1 (1 IND)					1	1	2 (1 GBR)		5 (2)	4.76 (8.00)
Iceland								3 (2 GBR)		3 (2)	2.85 (8.00)
Japan	1	1 (1 USA)	1 (1 USA)				1 (1 LUX)	4 (2 USA)		8 (5)	7.61 (20.00)
Netherlands	1		3 (1 GBR) (1 DEU)					1		5 (2)	4.76 (8.00)
New Zealand			ŕ					1		1	0.95 (0.00)
Norway							1	1		2	1.90 (0.00)
Spain								3 (1 BRA)		3 (1)	2.85 (4.00)
Sweden								2 (1 NOR)		2 (1)	1.90 (4.00)
Switzerland	2						1 (1 AUS)	2 (1 SVN)	1	6 (2)	5.71 (8.00)
United Kingdom	1							2		3	2.85 (0.00)
United States	6	9 (1 NLD)	3		5	4 (1 CAN)	15 (1 GBR) (1 CHE) (1 IRL)	8	1	51 (5)	48.57 (22.00)
Total	13(1)	10(2)	7 (3)	1	5	5(1)	21(6)	41(12)	2	105 (25)	100 (100)

Dorcontago	12.38	9.52	6.66	0.95	4.76	4.76	20.00	39.04	1.90	100	
Percentage	(4.00)	(8.00)	(12.00)	(0)	(0)	(4.00)	(24.00)	(48.00)	(0)	(100)	

Table 2. Steps of sample construction

FinTech-acquiring-banks	N. Acquisitions (Observations)	N. Entities
Step 1: Download worldwide acquisitions from S&P ²⁸	24,309	8,943
Step 2: Keep only acquiring banks ²⁹	4,878	2,184
Step 3: Keep only FinTech-acquiring banks ³⁰	156	109
Step 4: Keep only FinTech-acquiring banks in OECD countries	105	80
FinTech-non-acquiring banks		
Step 5: Construction of sample of FinTech-non-acquiring banks	(77,500)	7,755
PSM Matching strategy	Acquiring/Non- acquiring	Acquiring/Non-acquiring
Step 6: PSM matching estimation	105/105	80/105
Step 7: Inclusion of corporate governance variables based on information availability ³¹	105/94	80/94

²⁸ All the acquisitions performed by financial institutions during the period 2010-2018.

²⁹ Removal of non-bank financial institutions, as well as specialised banks.
³⁰ Removal of banks acquiring targets other than what classified as "FinTech" according to S&P's criteria. The difference between the number of acquisitions and the number of entities arises from the presence of multiple acquisitions made by the same entity. Only completed deals at the time of the search were retained.

³¹ In the final step of our sample construction, following the matching, 11 banks were removed from the control group given the lack of availability of key corporate governance variables.

Table 3. Descriptive statistics

This table presents the descriptive statistics for each variable for FinTech-acquiring and non-acquiring banks. The column "Diff" reports the *p*-value from the *t*-test on the difference between the means of the two groups. The variables are defined in Table A1 in Appendix A.

	FinTech-acquiring Banks					FinTech-non-acquiring Banks				D:((
Variables	Obs.	Mean	St. Dev.	Min.	Max.	Obs.	Mean	St. Dev.	Min.	Max.	Diff
Panel A. CEO and board variables											
CEO_tenure	104	5.47	4.97	0.08	35.30	94	5.52	4.95	0	21.50	0.93
CEO_age	105	55.95	6.36	38	72	91	67.25	6.88	53	81	0.00
CEO_duality	105	0.42	0.42	0	1	91	0.40	0.49	0	1	0.71
CEO_foreigner	105	0.42	0.49	0	1	94	0.50	0.50	0	1	0.32
CEO_education	101	0.09	0.30	0	1	90	0.15	0.36	0	1	0.24
Board_size	104	11.94	4.44	5	29	91	14.75	3.48	7	25	0.00
Gender_diversity (%)	104	63.48	20.89	0	100	91	77.58	24.63	0	100	0.00
National_diversity (%)	104	16.58	22.90	0	70	91	13.56	21.89	0	80	0.34
				Panel B.	Bank variab	les					
E/TA (%)	105	9.35	3.42	4.33	14.68	94	8.36	3.50	4.33	14.98	0.04
ROA (%)	105	0.80	0.80	-3.90	3.01	94	0.28	0.89	-3.90	1.62	0.00
Cost_to_income (%)	105	64.83	12.24	37.91	97.10	94	65.87	15.32	37.91	106.47	0.59
Liquidity (%)	105	32.59	30.06	2.15	118.65	94	18.53	20.18	1.60	103.54	0.00
NPLs (%)	105	2.03	2.25	0	13.01	94	2.94	2.51	0.20	13.01	0.01
IT_expenditure (%)	105	9.64	5.82	1.02	31.49	94	9.28	4.23	1.17	24.10	0.62
			Panel C. Ma	acroeconon	nic and insti	tutional var	iables				
Gov_effectiveness	105	105	1.59	0.19	1.02	94	1.53	0.24	0.44	2.05	0.09
GDP_growth (%)	105	105	2.14	0.98	-2.87	94	1.03	1.97	-5.41	3.83	0.00
N.branches	105	105	31.79	10.79	5.50	94	36.90	17.19	12.44	104.20	0.01

Table 4. Bank propensity to acquire FinTech

This table presents the estimated marginal effects of the probit regression. The dependent variable is an indicator variable equal to one if a bank acquires a FinTech company during 2010-2018, and zero otherwise. Robust standard errors appear in parentheses. *, ***, and *** indicate significance at the 10%, 5%, and 1% level, respectively.

	(1)	(2)	(3)	(4)
CEO- and board-characterist				
CEO_tenure	0.0190***	0.0178***	0.0119***	0.0115***
	(0.0039)	(0.0034)	(0.0030)	(0.0026)
CEO_age	-0.0399***	-0.0361***	-0.0303***	-0.0348***
	(0.0021)	(0.0024)	(0.0027)	(0.0053)
CEO_duality	0.0341	0.0373	0.0301	0.0414
	(0.0405)	(0.0377)	(0.0389)	(0.0446)
CEO_foreigner	-0.1621***	-0.1531***	-0.0966**	-0.1187***
	(0.0520)	(0.0457)	(0.0452)	(0.0419)
CEO_education	-0.0588	-0.0321	0.0554	0.1113**
	(0.0446)	(0.0514)	(0.0413)	(0.0474)
Board_size	0.0038	0.0004	0.0059	0.0006
	(0.0057)	(0.0053)	(0.0049)	(0.0039)
Gender_diversity	-0.0065***	-0.0063***	-0.0070***	-0.0086***
	(8000.0)	(0.0008)	(0.0009)	(0.0016)
National_diversity	-0.0009	-0.0009	-0.0002	0.0009
	(8000.0)	(0.0007)	(0.0009)	(0.0009)
Bank- macroeconomic- and in		` ,	(:::::)	()
E/TA			0.0209***	0.0211***
			(0.0069)	(0.0071)
ROA			0.0325	0.0377
			(0.0457)	(0.0545)
Cost_to_income			0.0001	0.0020
			(0.0015)	(0.0015)
Liquidity			0.0041***	0.0036***
4			(0.0011)	(0.0010)
NPLs			-0.0091	-0.0303**
			(0.0100)	(0.0142)
IT_expenditure			-0.0060	-0.0098**
_ 1			(0.0043)	(0.0045)
GDP_growth			0.0726***	0.0759***
			(0.0195)	(0.0221)
Gov_effectiveness			-0.0016	-0.0020**
<i>– 11</i>			(0.0010)	(0.0008)
N.branches			0.0003	0.0028
			(0.0017)	(0.0017)
Obs.	184	184	184	184
Year Fe	No	Yes	No	Yes
Wald Chi2	41.40	81.79	88.67	107.88
Log pseudolikelihood	-44.25	-35.85	-29.39	-21.12
Pseudo R2	0.65	0.71	0.77	0.82

Table 5. Domestic vs. Cross-border FinTech acquisitions

This table presents the estimated results of the multiprobit regression when distinguishing between domestic and cross-border FinTech acquisitions. The dependent variable is an indicator variable equal to (i) zero if a bank does not acquire any FinTech company during 2010-2018; (ii) one if a bank acquires a domestic FinTech company during 2010-2018; and (iii) two if a bank acquires FinTech across the borders during 2010-2018. Robust standard errors appear in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% level, respectively.

	(1)	(2)
	Domestic	Cross-Border
CEO_foreigner	-0.2379**	0.1047
	(0.0977)	(0.0794)
National_diversity	-0.0041**	0.0051**
	(0.0018)	(0.0020)
Gov_effectiveness	0.0038	-0.0065**
	(0.0029)	(0.0033)
N.branches	0.0065	-0.0033
	(0.0060)	(0.0053)
Obs.	184	184
Year Fe	Yes	Yes
Wald Chi2	277.06	277.06
Log pseudolikelihood	-39.53	-39.53
Pseudo R2	0.77	0.77
Bank controls	Yes	Yes
Country controls	Yes	Yes

Table 6. Single vs. Multiple FinTech acquisitions

This table presents the estimated results of the multiprobit regression when distinguishing between single and multiple FinTech acquisitions. The dependent variable is an indicator variable equal to (i) zero if a bank does not acquire any FinTech company during 2010-2018; (ii) one if a bank acquires a single FinTech company during 2010-2018; and (iii) two if a bank engages in multiple FinTech acquisitions during 2010-2018. Robust standard errors appear in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% level, respectively.

	(1)	(2)
	Single	Multiple
CEO_age	-0.0210***	-0.0151***
	(0.0072)	(0.0047)
CEO_duality	-0.0885	0.1356**
	(0.0686)	(0.0616)
Cost_to_income	-0.0017	0.0044*
	(0.0030)	(0.0027)
IT_expenditure	0.0025	-0.0102**
	(0.0073)	(0.0051)
Obs.	184	184
Year Fe	No	Yes
Wald Chi2	248.89	248.89
Log pseudolikelihood	-69.31	-69.31
Pseudo R2	0.64	0.64
Bank controls	Yes	Yes
Country controls	Yes	Yes

Table 7. Non-FinTech acquisitions

This table reports the average values and standard deviations of the number of non-FinTech acquisitions by FinTech-acquiring and non-acquiring banks. "Obs." indicates the number of banks in each group. The reference period is 2010-2018. The row "Diff" reports the p-value from the t-test on the difference between the means of the two groups.

	Obs.	Mean	St. Dev.
All	384	1.83	0.26
FinTech-acquiring Banks	190	1.76	0.31
FinTech-non-acquiring Banks	194	1.89	0.41
Diff		0.80	

Table 8. Bank propensity to acquire FinTech using an alternative matching strategy

This table presents the estimated marginal effects of the probit regression. The dependent variable is an indicator variable equal to one if a bank acquires a FinTech company during 2010-2018, and zero otherwise. Robust standard errors appear in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% level, respectively.

	(1)	(2)
CEO- and board-characteristics		
CEO_tenure	0.0095*	0.0084
	(0.0055)	(0.0061)
CEO_age	-0.0291***	-0.0287***
-	(0.0051)	(0.0052)
CEO_duality	0.1247*	0.1187*
	(0.0669)	(0.0701)
CEO_foreigner	0.1061	0.1095
	(0.0758)	(0.0765)
CEO_education	0.1590*	0.1778*
	(0.0952)	(0.0983)
Board_size	-0.0144*	-0.0141*
	(0.0087)	(0.0086)
Gender_diversity	-0.0078***	-0.0073***
	(0.0028)	(0.0027)
National_diversity	-0.0036**	-0.0037***
	(0.0013)	(0.0013)
Obs.	146	146
Year Fe	No	Yes
Wald Chi2	63.47	66.64
Log pseudolikelihood	-64.65	-64.01
Pseudo R2	0.35	0.36
Country controls	Yes	Yes

Appendix A

Table A1. Description of the variables

This table provides the definitions of the variables employed in the empirical analysis. The associated expected signs for the coefficients on the variables are also reported.

Variable	Label	Definition	Exp.
CEO variables			
CEO tenure	CEO_tenure	The number of years since being appointed as a CEO.	+/-
CEO age	CEO_age	CEO age in years.	-
CEO duality	CEO_duality	Dummy variable: 1 if the CEO is chairman of the board, 0 otherwise.	+/-
Foreign CEO	CEO_foreigner	Dummy variable: 1 if the CEO's nationality is different from where the bank is headquartered, 0 otherwise.	+/-
CEO education	CEO_education	Dummy variable: 1 if the CEO holds a doctoral degree, 0 otherwise.	+
Board variables			
Board size	Board_size	The number of directors elected to the board.	+/-
Board gender diversity	Gender_diversity	The fraction of male directors to the total number of board members.	+/-
Board nationality diversity	National_diversity	The fraction of foreign board members to the total number of board members.	+
Bank variables			•
Equity to total assets	E/TA	The ratio of equity to total assets.	+/-
Return on assets	ROA	The ratio of net income to total assets.	+/-
Cost to income	Cost_to_income	The ratio of operating expenses to operating income.	+/-
Liquid assets	Liquidity	The ratio of liquid assets to customers and short-term funding.	+
Credit risk	NPLs	The ratio of non-performing loans to gross loans.	+
IT expenditure	IT_expenditure	The ratio of IT expenses to operating expenses.	-
Macroeconomic and	institutional variables	S	
GDP growth	GDP_growth	The yearly growth rate of nominal GDP. This variable is computed relative to the country where the acquiring bank is located.	+
Government effectiveness	Gov_effectiveness	It captures the perceptions of the quality of public services, the quality of the civil service and the degree of its independence from political pressure, the quality of policy formulation and implementation, and the credibility of the government's commitment to such policies. Estimates range from -2.5 (lowest value) to 2.5 (highest value). This variable is computed relative to the country where the acquiring bank is located.	+/-

Number of branches	N.branches	The number of bank branches for a hundred thousand	+/-
		individuals. This variable is computed relative to the	
		country where the acquiring bank is located.	

Table A2. PSM: Covariates Balancing

The table reports the *Size* (measured by the logarithm of bank total assets) for the groups of FinTech-acquiring and FinTech-non-acquiring banks before and after the matching. Results refer to the first matching strategy, as discussed in Section 3.1.

Sample	Be	fore Matching	<u>{</u>	After Matching			
	FinTech-non-			FinTech-non-			
	FinTech-	acquiring		FinTech-acquiring	acquiring		
Variable	acquiring Banks	Banks	P-value	Banks	Banks	P-value	
Size	17.97	11.71	0.00	17.94	17.93	0.99	

Figure A1. Standardized bias across covariates

The graph displays the standardized bias (%) across covariates (in the case of the first matching strategy, *Size*) for the groups of FinTech-acquiring and FinTech-non-acquiring banks before and after the matching.

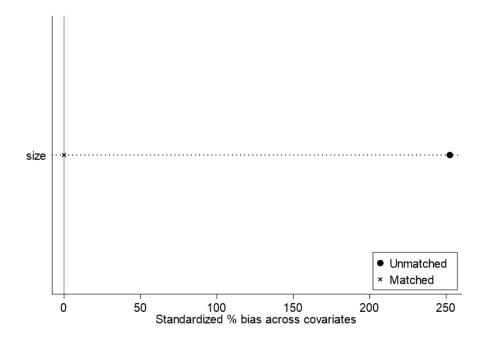


Table A3. Correlation matrix

This table reports the pairwise correlation coefficients between the variables included in the empirical analysis. Bold values indicate a statistical significance at the 5% level. The definition of the variables is provided in Table A1.

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17
CEO_tenure (1)		0.22	0.10	-0.28	0.09	-0.13	0.15	0.00	0.11	0.12	-0.03	-0.15	0.09	-0.06	0.05	0.00	0.03
CEO_age (2)	0.22		0.19	-0.03	0.05	0.34	0.15	-0.18	-0.06	-0.16	0.04	-0.22	0.11	-0.17	-0.27	-0.16	0.03
CEO_duality (3)	0.10	0.19		-0.26	-0.16	0.17	0.18	-0.11	0.15	-0.04	0.06	-0.08	0.00	-0.07	-0.02	-0.01	-0.17
CEO_foreigner (4)	-0.28	-0.03	-0.26		0.15	0.31	-0.26	0.22	-0.26	-0.00	-0.08	0.29	0.25	0.09	-0.08	-0.06	0.06
CEO_education (5)	0.09	0.05	-0.16	0.15		0.12	0.14	0.17	-0.04	0.04	0.02	-0.04	-0.05	-0.01	0.03	0.10	-0.14
Board_size (6)	-0.13	0.34	0.17	0.31	0.12		0.10	0.03	-0.26	-0.23	0.16	0.02	0.22	-0.01	0.23	-0.14	-0.07
Gender_diversity (7)	0.15	0.15	0.18	-0.26	0.14	0.10		0.08	-0.06	-0.08	-0.12	-0.15	0.02	-0.01	0.05	-0.05	0.07
National_diversity (8)	0.00	-0.18	-0.11	0.22	0.17	0.03	0.08		-0.18	-0.00	0.03	0.22	0.04	0.28	0.06	0.21	-0.04
E/TA (9)	0.11	-0.06	0.15	-0.26	-0.04	-0.26	-0.06	-0.18		0.08	-0.02	-0.06	-0.11	-0.09	0.11	-0.03	-0.02
ROA (10)	0.12	-0.16	-0.04	-0.00	0.04	-0.23	-0.08	-0.00	0.08		-0.28	0.08	-0.30	0.03	0.28	0.04	0.01
Cost_to_income (11)	-0.03	0.04	0.06	-0.08	0.02	0.16	-0.12	0.03	-0.02	-0.28		0.11	-0.01	0.10	-0.06	0.05	-0.07
Liquidity (12)	-0.15	-0.22	-0.08	0.29	-0.04	0.02	-0.15	0.22	-0.06	0.08	0.11		0.03	0.24	0.06	0.06	-0.05
NPLs (13)	0.09	0.11	0.00	0.25	-0.05	0.22	0.02	0.04	-0.11	-0.30	-0.01	0.03		-0.11	-0.27	-0.33	0.23
IT_expenditure (14)	-0.06	-0.17	-0.07	0.09	-0.01	-0.01	-0.01	0.28	-0.09	0.03	0.10	0.24	-0.11		0.17	0.19	-0.13
GDP_growth (15)	0.05	-0.27	-0.02	-0.08	0.03	0.23	0.05	0.06	0.11	0.28	-0.06	0.06	-0.27	0.17		0.17	-0.24
Gov_effectiveness (16)	0.00	-0.16	-0.01	-0.06	0.10	-0.14	-0.05	0.21	-0.03	0.04	0.05	0.06	-0.33	0.19	0.17		-0.52
N.Branches (17)	0.03	0.03	-0.17	0.06	0.14	-0.07	0.07	-0.04	-0.02	0.01	-0.07	-0.05	0.23	-0.13	-0.24	-0.52	

Online Appendix

Table 1 below reports information about the distribution of the FinTech and non-FinTech acquisitions performed by the banks in our sample during the years 2010-2018, based on our main matching exercise. In particular, as specified in Section 3.1, to match the two groups of banks we rely on the total assets variable (a proxy for bank size) and the country where the banks are headquartered. This approach enables sample size maximization and the possibility to better deal with multiple acquisitions (about 41% in our settings), given that, for instance, a bank acquiring two FinTech firms in two different years can be matched to the same control unit in two different years. As shown in Table 1 below, overall the two groups of banks appear to be evenly distributed over time.

Table 1. Acquisitions distribution over time

Year	FinTech-acquisitions	Non-FinTech acquisitions
2010	8	8
2011	7	17
2012	12	7
2013	3	17
2014	9	6
2015	9	9
2016	19	8
2017	22	11
2018	16	11
Total	105	94

As an additional robustness test, Table 2 reports the results of our main analysis (as presented in Equation (1) in Section 3.2), by using a *logit* regression model instead of a *probit* model. Findings appear to be qualitatively similar, which further validates our main results.

Table 2. Bank propensity to acquire FinTech - Logit regression model

This table presents the estimated marginal effects of the logit regression. The dependent variable is an indicator variable equal to one if a bank acquires a FinTech company during 2010-2018, and zero otherwise. Robust standard errors appear in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% level, respectively.

	(1)	(2)	(3)	(4)
CEO- and board-characteristics				
CEO_tenure	0.0188***	0.0180***	0.0105***	0.0107***
	(0.0035)	(0.0032)	(0.0031)	(0.0029)
CEO_age	-0.0390***	-0.0359***	-0.0312***	-0.0306***
_	(0.0021)	(0.0029)	(0.0035)	(0.0046)
CEO_duality	0.0321	0.0334	0.0261	0.0258
· ·	(0.0397)	(0.0397)	(0.0429)	(0.0629)
CEO_foreigner	-0.1705***	-0.1712***	-0.1072**	-0.0991***
	(0.0500)	(0.0512)	(0.0509)	(0.0633)
CEO_education	-0.0511	-0.0272	0.0705	0.1008*
	(0.0416)	(0.0419)	(0.0508)	(0.0563)
Board_size	0.0039	0.0005	0.0064	-0.0001
	(0.0058)	(0.0057)	(0.0053)	(0.0065)
Gender_diversity	-0.0062***	-0.0061***	-0.0072***	-0.0075***
	(0.0007)	(8000.0)	(0.0011)	(0.0017)
National_diversity	-0.0008	-0.0011	-0.0002	0.0001
	(0.0007)	(0.0007)	(0.0011)	(0.0010)
Bank- macroeconomic- and institu	ıtional-character	ristics		
E/TA			0.0241***	0.0196**
			(0.0085)	(0.0090)
ROA			0.0323	0.0546
			(0.0469)	(0.0582)
Cost_to_income			0.0000	0.0016
			(0.0017)	(0.0018)
Liquidity			0.0040***	0.0039**
			(0.0013)	(0.0015)
NPLs			-0.0082	-0.0187
			(0.0125)	(0.0154)
IT_expenditure			-0.0043	-0.0095**
			(0.0047)	(0.0040)
GDP_growth			0.0648***	0.0620***
			(0.0216)	(0.0200)
Gov_effectiveness			-0.0012	-0.0021*
			(0.0010)	(0.0010)
N.branches			0.0010	0.0007
			(0.0017)	(0.0013)
01	104	404	464	464
Obs.	184	184	184	184

Year Fe	No	Yes	No	Yes	
Wald Chi2	32.82	58.77	59.96	64.61	
Log pseudolikelihood	-42.41	-35.37	-28.81	-22.70	
Pseudo R2	0.66	0.72	0.77	0.82	