

# Determinants of Bank Failures in a Deregulated Context: Evidence from the Portuguese Banking Sector in the 19<sup>th</sup> Century

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# Determinants of Bank Failures in a Deregulated Context: Evidence from the Portuguese Banking Sector in the 19<sup>th</sup> Century

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# Abstract

This dissertation investigates the determinants of bank failures in the absence of comprehensive regulatory policies and of supervision in the banking sector. These features trigger the incorporation of new banks, contributing to an increasingly competitive environment. The fintech landscape still lacks regulation and it is increasingly composed by more players, which are gaining a foothold in the banking sector by offering more sophisticated and customized products and services than conventional banks. Since this new fintech era shares those peculiarities with the 19<sup>th</sup> century Portuguese banking sector, the latter was considered as an ideal and "clean" laboratory to study bank failures. This prevents the emergence of potential puzzling effects given that the banking sector in Portugal was relatively new and simple. In this sense, it was built a new dataset comprising the Portuguese banks' accounts between 1858 and 1887 to evaluate the bankruptcies and survivals of banks after the 1876 crisis. This thesis shows that the age of a bank is critical to survive a crisis following a period of deregulation which led to the increase of the number of banks operating. Further analysis indicates that having a low level of capital and providing unbalanced amounts of credit, significantly higher than deposits, are also determinant to bank failures.

JEL Classifications: E50; G21; G28; G33

**Keywords:** Bank failures; Banking deregulation; Bank runs; Banking crisis; Financial crisis

# Determinants of Bank Failures in a Deregulated Context: Evidence from the Portuguese Banking Sector in the 19<sup>th</sup> Century

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## Resumo

Esta dissertação investiga os factores responsáveis pela falência de instituições bancárias na ausência de políticas regulatórias e de supervisão no sector bancário. Estas características desencadeiam a criação de novos bancos, contribuindo para o aumento de competitividade neste sector. O panorama de fintech ainda não é suficientemente regulado e é constituído por cada vez mais empresas que estão a conquistar uma posição importante no sector bancário por oferecerem produtos e serviços mais sofisticados e personalizáveis que a banca convencional. Uma vez que esta nova era de fintech partilha as peculiaridades descritas previamente com a banca portuguesa na segunda metade do século XIX, esta foi considerada como o contexto ideal para estudar a falência de bancos. Isto previne o aparecimento de efeitos potencialmente confusos visto que o sector bancário português era relativamente recente e simples. Neste sentido, foi constituída uma nova base de dados composta pelas contas dos bancos em actividade em Portugal entre 1858 e 1887 para avaliar os bancos que faliram e sobreviveram após a crise de 1876. Esta tese evidencia que a idade de um banco é crítica para sobreviver a uma crise no seguimento de um período de desregulação que provoca o aumento do número de bancos em operação. Para além disso, uma análise mais profunda indica que apresentar um nível reduzido de capital e conceder valores deseguilibrados de crédito, consideravelmente superiores ao valor de depósitos, são factores determinantes para a falência de bancos.

Classificações JEL: E50; G21; G28; G33

Palavras-chave: Falências bancárias; Desregulação bancária; Corridas bancárias; Crise

bancária; Crise Financeira

Difficulties break some men but make others.

No axe is sharp enough to cut the soul of a sinner who keeps on trying, one armed with the hope that he will rise even in the end.

Nelson Mandela

Deus quer, o homem sonha, a obra nasce.

Fernando Pessoa

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# List of Contents

I.	Introduction 1
II.	Literature Review
III.	Historical Context
IV.	Data and Methodology10
V.	Empirical Findings
i.	Univariate cross-section logit models
ii.	Univariate panel data logit model
iii.	Survival Analysis   Kaplan-Meier Estimates
iv.	Panel data logit models
VI.	Conclusions
VII.	Limitations
VIII.	References
IX.	Appendices
i.	Example of year accounts of a bank
ii.	Example of monthly accounts for 187641

# List of Figures

Figure 1 - Sample selection waterfall (number of banks) 11
Figure 2 - Sample selection waterfall (number of observations
Figure 3 - Incorporation of new banks (number of banks) 12
Figure 4 - Number of new banks created before the 1876 crisis and bankrupt banks after
the 1876 crisis
Figure 5 - Herfindahl-Hirschman Index (Market Concentration) Evolution between
1858 and 1887
Figure 6 - Evolution of deposits of all active banks and number of active banks between
1858 and 1887 14
Figure 7 - Evolution of deposits of all active banks in 1876 14
Figure 8 - Portugal map with number of banks by county and region (North and South)
Figure 9 – Kaplan-Meier survival function estimates
Figure 10 - Kaplan-Meier survival function estimates for banks in the South and North

# List of Tables

Table 1 - Variables definition	. 16
Table 2 – Summary statistics	. 19
Table 3 – Univariate cross-section logit models estimation	. 24
Table 4 - Univariate panel data logit model (4) estimation.	. 25
Table 5 – Log-rank test for equality of survivor functions (p-value in italic)	. 26
Table 6 – Panel data logit model (5) estimation	. 28
Table 7 - Summary statistics with 80% winsorization.	. 31
Table 8 – Panel data logit model (6) estimation	. 33

# I. Introduction

This dissertation aims to study the main drivers of bank failures in a context with scarce supervision and a large number of new entrants. On the verge of a new deregulation wave, where fintech is increasingly taking a prominent role in the banking industry, it is relevant to study the bankruptcy determinants in a highly competitive environment. As a matter of fact, there is an increasing number of fintech start-ups, which are already offering some products and services more sophisticated than the ones offered by conventional banks, benefiting from growing in a disruptive sector whose regulation is scarce due to its novelty and high degree of technological complexity. One can thus try to learn from the failures of young and lightly regulated financial institutions in the second half of the 19<sup>th</sup> century and draw some parallels with the current situation.

In this context, the Portuguese banking sector in the second half of the 19<sup>th</sup> century may be considered the ideal laboratory to study the interconnection between deregulation, competition and bankruptcies. In fact, this century was characterized by the Liberalism rise in Portugal and, consequently, it was a period of less regulation which triggered more competition as new banks were established. Furthermore, since the Portuguese banking sector was relatively novel, it is plausible that there are no potential confounding effects given the simplicity of banks' operations. Indeed, the 19<sup>th</sup> century Portuguese banking activity can be summarized to a straightforward combination of deposits and loans, being exposed to the classical credit, liquidity and interest rate risks, which could ultimately lead to a bankruptcy situation. Lastly, the financial crisis and the associated bank runs comprised in this framework that occurred in 1876 allow us to analyze the abovementioned bankruptcy side. This way, it is possible to draw a parallelism between the two contexts and potentially gain insights about the fintech banking sector and the need of regulatory policies.

I believe that this study and its results can be interesting for bank supervisors, as well as for bank investors, since they may be used as a starting point to impose new regulatory policies in line with the most important identified risks.

With the aim of studying bankruptcies on banks, especially among newly-created ones, the methodology used was essentially based on the logit binomial model to assess the probability of bankruptcy. In addition, it was performed a survival analysis, based on the Kaplan-Meier estimates, to examine the relationship between the probability of survival and the age of banks.

The main findings are that the level of capital and the balance between credit and deposits are relevant to survive crises. Moreover, the banks' age, *id est* the years under activity, reveals to be critical on bankruptcies, especially when banks are incorporated during a deregulation period.

Finally, the present dissertation has the following structure: Section II exhibits the literature review where the main theories and concepts concerning bank runs, bankruptcies, regulation and the duality between financial stability and competition are revisited; Section III comprises the historical context where it is provided a detailed analysis of the economic, legal and political situation in the second half of the 19<sup>th</sup> century in Portugal; Section IV describes the data used as baseline for this study as well as the inherent sample selection and the applied methodology; Section V presents the main results derived from the applied models; Section VI displays the main conclusions and, in Section VII, the main limitations of this dissertation are exposed.

# II. Literature Review

Bank runs are essentially liquidity shortage phenomena which are widely common during downturn periods. Briefly, they are consequence of having short-term liabilities, namely deposits, financing less liquid long-term assets, usually loans. When there is a confidence decline on banks by depositors, arises an environment of fear materialized by a high number of simultaneous withdrawals which grow as the probability of default and possible consequent bankruptcy increases. In this sense, it is fundamental to have regulatory policies which force banks to be prepared for these situations, given that it can ultimately lead to bank insolvency and, more importantly, create systemic aggregate liquidity risk (Panetti, 2016). One common approach to deal with these risks is to force banks to comply with minimum capital/reserve requirements defined by a supervisor, as well as the establishment of a sound and credible deposit insurance mechanism. As a matter of fact, following the financial crisis of 2007-2008, there was an increasing number of new regulations, as Basel III, addressing liquidity ratios with more detail and rigor.

Regarding the diminishing levels of confidence that feed bank runs, there are two traditional approaches which seek to justify them. According to Kindleberger (1978), banking panics result from "mass-hysteria" and, in line with this, Diamond & Dybvig (1983) postulated that they might be caused by self-fulfilling prophecies. On the other hand, this confidence decline can be purely a result of business cycles, *id est*, bank runs are seen as non-random events (Gorton, 1988).

When banks offer demand deposits, they gain foothold in the competitive market, benefiting from people's different preferences on the withdrawal timing, due to their distinct consumption patterns. Nonetheless, one of the equilibria is a bank run, where everyone decides to withdraw at the same time, even the agents that would prefer to do it later if they would not be pessimistic about a potential default. So, according to the selffulfilling view, there is an incentives' distortion, the efficient risk sharing equilibrium is lost and withdrawing turns out to be optimal for every depositor.

Whereas in the business cycle view, it is considered that real economy fundamentals have an impact on the bank assets, potentially leading to their value decrease during recession periods. As a matter of fact, Gorton (1998) shows that during the U.S. National Banking Era, there was a bank run whenever a variable that could predict a business cycle downturn would indicate it.

Morris and Shin (1998) proposed the reconciliation of the two views composing the global game approach. In this sense, this model incorporates bank runs as potential derivations of both shifts in depositors' confidence (illiquidity outcome) and from real economy status (insolvency outcome), allowing to have a deeper understanding on Governments' intervention.

In this context, it is important to address the role of regulation policies in handling the duality between financial stability and competition. On one hand, there is one view present in the literature - "competition-fragility" - which believes that increasing bank competition allows lessening market power and profitability margins. Consequently, there is more risk-taking by banks to increase their profit margins (Keeley, 1990; Marcus, 1984). On the other hand, the "competition-stability" view considers the rise of moral hazard and adverse selection problems as it is harder for borrowers to bear high interest rates, due to a concentrated banking market, and thus increasing the bank risk (Boyd & De Nicolo, 2005). Nevertheless, it can also exist more risk-taking if there is the mindset of "too big to fail", also linked to the potential Government interventions (Berger, Klapper, & Turk-Ariss, 2009; Boyd, De Nicoló, & Jalal, 2006).

Although competition is positive in terms of a better allocation of resources, it is fundamental to ensure there are an appropriate supervision and policies which provide a balanced framework that can exist at the same time with financial stability (Allen & Gale, 2004). For instance, the existence of minimum capital requirements enables more equitable competition alongside the decrease on banks' risk taking. Furthermore, depositrate controls are other policy instruments that can be more efficient than capital controls on preventing moral hazard (Hellmann, Murdock, Stiglitz, Calomiris, & Schweikart, 1991).

According to Kaminsky & Reinhart (1999) there is a strong connection between banking and currency crises in a deregulated and liberal framework. In fact, their simultaneous appearance deepens and boosts the negative consequences of each other, contributing to harsh financial crises.

The 1876 Portuguese Financial Crisis is an ideal setting to study bank runs, since it constitutes an environment with no significant regulatory policies neither a Central Bank acting as supervisor. Additionally, unit banking was prevailing in this early period of the Portuguese banking system. This way, it is possible to waive probable confounding effects of regulation and to settle a "clean" laboratory as in Braggion, Manconi, & Zhu (2017) and, more recently, in Bignon & Jobst (2017) and Carlson, Correia, & Luck (2018), which use data from the banking sector during the 19<sup>th</sup> century in France and in United States, respectively.

Furthermore, although there is an extensive literature on the main drivers of bankruptcies in banks, it was mainly focused on bank failures between 1980 and 1990 and, more recently, on the 2007-2008 financial crisis. In these periods, the banking sector was characterized by much more complex structures and sophisticated products and services than in the 19<sup>th</sup> century. Nonetheless, the first research stream, including Cole & Gunther (1995); DeYoung (2003); Thomson (1991); Whalen (1991) and Wheelock & Wilson (2000), has found that bankruptcies can be predicted by low asset quality (nonperforming loans), high concentrations of business or commercial real estate loans, illiquidity, fast asset growth, cost inefficiency and/or poor management, reliance on non-core deposit funding, low profitability and low equity capital. In a nutshell, banks characterized by low capital levels as well as illiquid and low-quality assets had more probability of failing (Wheelock & Wilson, 2000).

The more recent research stream on the financial crisis, for instance Altunbas, Manganelli, & Marques-Ibanez (2011); Cole & White (2012), has attained similar conclusions regarding these predictors when constructing early warning models for bank failures.

Lastly, according to DeYoung & Hasan (1998), new banks can be compared to business start-ups in other industries as both initially exhibit losses and, in the subsequent years, low earnings. Additionally, this study found that not only a bank with an activity of one year is much less profit efficient than an established bank, but also that the former is, in general, only able to attain the latter's profit efficiency levels after 9 years of activity.

# III. Historical Context

One of the first financial crises in Portugal occurred in 1876. In order to understand the dynamics of this depression, including the main causes, it is crucial to do an analysis to the economic and political context during the second half of 19<sup>th</sup> century.

During 1846-1847, Portugal faced a monetary crisis which started with the establishment of the non-convertibility of Banco de Lisboa banknotes by the Decree of May 23<sup>rd</sup>, 1846. Afterwards, the Royal Charter on 19<sup>th</sup> November 1846 established the creation of Banco de Portugal (Bank of Portugal), resulting from the merger of Banco de Lisboa and Companhia Confiança Nacional. Then there was a recovery period with the Decree of December 9<sup>th</sup>, 1847<sup>1</sup> and, in 1850, the Decree of April 16<sup>th</sup> extended the right to issue banknotes to all the banking institutions which was until that time only allowed to Banco de Portugal<sup>2</sup>. On July 29<sup>th</sup>, 1854, it was published a law imposing the gold standard in Portugal, along with the possibility of converting banknotes without any limit in gold.

In this context, in 1858 (the first year in my sample), there were three commercial banks and three savings banks. In 1862, the commercial bank Banco União do Porto and the savings bank Caixa Económica Fayalense were incorporated and, in the subsequent year, the same happened to London and Brazilian Bank, with branches in Lisbon and Oporto. Additionally, it was established Nova Companhia Utilidade Pública, benefiting from the July 13<sup>th</sup>, 1863 Law<sup>3</sup> ("Lei das Sociedades Anónimas de Crédito Predial ou Agrícola") which allowed to create a property and/or farm credit (*Crédito Predial ou Agrícola*) public limited liability company exempt from taxes. The number of banks kept increasing with the creation of the Portuguese and Brazilian Bank, Banco Nacional Ultramarino, Banco Lusitano, Banco do Minho and Companhia Geral de Crédito Predial Portuguez in 1864.

In 1866, the June 22<sup>nd</sup> Law<sup>3</sup> authorized the establishment of district industrial and farm credit banks by social institutions (*Misericórdias, hospitais, irmandades* and *confrarias*) and the June 22<sup>nd</sup>, 1867 Law<sup>3</sup> ruled these banks' organization, governance and activity. With this policy, the Portuguese Government was aiming to foster growth

<sup>&</sup>lt;sup>1</sup> https://www.museudodinheiro.pt/uploads/2017/04/crise-monetaria-de-1846-1847-hsb-valerio-pt.pdf

<sup>&</sup>lt;sup>2</sup> https://www.bportugal.pt/page/historia

<sup>&</sup>lt;sup>3</sup> legislacaoregia.parlamento.pt

across all the territory. This way the agriculture and industrial companies outside the main cities could benefit from having access to these banks, which had a *modus operandi* more similar to savings banks. Under this law, Banco Agrícola e Industrial Viziense (1868), Banco Agrícola e Industrial de Vianense (1873), Banco Agrícola e Industrial de Villa Real (1874), Banco Agrícola e Industrial Farense (1874), Banco Agrícola e Industrial de Ponte de Lima (1876) and Banco Agrícola e Industrial da Extremadura (1876) were created (Companhia Geral de Crédito Predial Português after the law being published operated in its terms).

The June 22<sup>nd</sup>, the 1867 Law<sup>3</sup> also regulated the public limited liability companies ("Lei das Sociedades Anónimas") by facilitating their incorporation. As a matter of fact, it enacted that there was no longer a previous mandatory Government authorization for a bank to start its operations. It would only be needed to register the bank in the Government Gazette (*Diário Oficial do Governo*) and to ensure its supervision by a Board of Auditors (*Conselho Fiscal*), which had the responsibility of analyzing and approving the balance sheet, the profit and loss statement and the annual report with the bank status. These would then have had to be published in the Government Gazette with a report from the Board of Auditors, if approved in the General Meeting of Shareholders.

After the enactment of this law, there was a period of strong growth in the number of banks incorporated. In fact, by 1867 there were 16 banking institutions (from which 4 were savings banks) and, by 1875, 56 (from which 5 were savings banks) reflecting the underlying stability and the peculiar liberal era's deregulation to increase competition, when there were not a real supervisor and regulatory policies. In this sense, it is possible to claim that the Portuguese banking sector remarkable growth during the second half of the 19<sup>th</sup> century benefited from the public investment promoted by Fontes Pereira de Melo's Governments and their liberal policies without an effective and reliable banks' supervision, aiming to diversify the public debt sources of financing<sup>4</sup>.

In this context, Portugal entered in a financial crisis in 1876, which gradually spread out from the North region to all the country. In fact, the Oporto marketplace (*Praça do Porto*) was especially struggling. In the run up to the crisis, there was a speculative environment with a large number of investments in Spanish Government bonds. These

<sup>&</sup>lt;sup>4</sup> https://www.cgd.pt/Institucional/Patrimonio-Historico-CGD/Estudos/Documents/Desenvolvimento-Banca-Portuguesa.pdf

securities suffered a significant depreciation, triggered by the 1864-1874 Spanish financial crisis, which led to liquidity shortage issues on banks as the distrustfulness atmosphere generated bank runs in May 1876<sup>5</sup>, which are clearly visible in the data collected.

Alongside the increasing number of banks and the investments in Spanish funds which ultimately led to a generalized lack of confidence reflected on bank runs, the report from Banco de Portugal, prepared for the Board of Shareholders' General Meeting on 29<sup>th</sup> August 1876, indicated other causes of the crisis, namely the incorporation of several firms in a speculative environment, the scarcity of remittances from Brazil, the increase of cereals imports, Portuguese Government's large amount of payments due abroad and bonds' coupon payments to be done overseas by Companhia de Caminhos de Ferro do Norte e Leste. All of these drivers jointly induced a large currency devaluation and the consequent increase on gold exports.

At the end, this report made warnings on the urge to review the legislation, namely the "Lei das Sociedades Anónimas" and the April 14<sup>th</sup>, 1874 Law, which strengthened Banco de Portugal's tax exemption and its non-exclusive right of issuing banknotes. The Board believed these laws were incomplete and insufficient as it was visible in the events that led to the crisis.

In response to the crisis, the Portuguese Government decreed a moratorium on August 18<sup>th</sup> and distributed funds to the banks (bailouts) as London granted a loan to face the loss of liquidity.

This crisis led to the bankruptcy of 11 banks, namely Caixa Económica Penhorista, Banco Agrícola e Industrial de Ponte de Lima, Banco do Porto, Banco Nacional, Companhia Crédito Portuense, Companhia Commercial e Industrial Portuense, Banco Commercial de Vianna, Banco Nacional Insulano, Banco Commercial de Braga, Banco União de Portugal e Brazil, Caixa de Crédito Industrial<sup>6</sup>.

<sup>&</sup>lt;sup>5</sup> https://www.cgd.pt/Institucional/Patrimonio-Historico-CGD/Estudos/Pages/Grande-crise-bancaria-Portugal-BNU.aspx

<sup>&</sup>lt;sup>6</sup> Valério, Nuno (coord.), Ana Bela Nunes, Carlos Bastien, Rita Martins de Sousa, Sandra Domingos Costa (2007), *História do Sistema Bancário Português - Da Formação do Primeiro Banco Português à Assunção pelo Banco de Portugal das Funções de Banco Central – 1822-1931*, Volume I. Lisboa: Banco de Portugal.

Lastly, it may be referred that, in this century, the Portuguese currency was *Real*, in plural *Réis*. The denomination *Conto de Réis*, in plural *Conto de* Réis, represents 1 million Réis (1:000\$000) and it was widely used.

# IV. Data and Methodology

The data for all Portuguese banks, including savings banks, during the second half of 19<sup>th</sup> century was obtained from the Bank of Portugal Archive. This is a completely new dataset collected from the document "Annaes de Estatística – Estatística Bancária", which comprehends the main banking accounts between 1858 and 1892, namely number of shares, realized capital, nominal capital, cash, bills of exchange, collateralized loans and deposits (annual and monthly examples in Appendices 1 and 2). The underlying timeframe allows considering 18 years before 1876 crisis and the subsequent 11 years, since it is the period where its effects are verifiable. Hence, the dataset used in this study comprises a timeframe between 1858 and 1887. In addition, the monthly accounts for each bank during 1876 were extracted.

Given that these data were only available on paper, this document was fully digitalized by Bank of Portugal Archive. I used the digitalized files to apply OCR (Optical Character Recognition) techniques, which allows to have the data in a format prepared to be manipulated and analyzed. In this sense, it was used OCR software with the required code to get all the data. Nevertheless, the high degree of deterioration of some figures associated with the underlying antiquity of the document led to defective and flawed outputs. So, the entirely data was manually uploaded, namely 82 pages of annual accounts between 1858 and 1892 and 10 pages of monthly accounts for 1876 (examples in Appendices 1 and 2, respectively). All the numbers were hand-checked one by one for three times to ensure the elimination of potential errors. In addition, I developed checks that include the basic rules of balance sheets reporting, namely in the capital, the number of shares and share price values available in the source document (Appendices 1 and 2).

This ambitious data collection effort allowed to create a database of the Portuguese banking system between 1858 and 1892, which can now be easily used by researchers.

After settling the dataset, it was initialized an EDA (Exploratory Data Analysis) to understand the figures and gather as many insights possible. In this context, I started by excluding the 2 banks that bankrupted before the 1876 crisis from the sample. Afterwards, the 2 banks that had their accounts in another currency were excluded alongside the 4 banks which were incorporated after the crisis. The observations excluded were ultimately considered the outliers of the sample, not existing the need for further

selection. Thereby, I started with a dataset comprised by 62 banks and 914 observations and, after the sample selection, I ended up with 54 banks and 835 observations to be analyzed (Figures 1 and 2). The entire dataset has 11 banks that went bankrupt after the crisis and 43 banks that remained active until the end of the period. During the years before crisis, especially the previous two years, there was a boom of new banks (startups) as it is displayed in Figures 3 and 4.



Figure 1 - Sample selection waterfall (number of banks). Exclusion of the 2 banks that bankrupted before the 1876 crisis from the sample; the 2 banks that had their accounts in another currency; and the 4 banks which were incorporated after the crisis.



Figure 2 - Sample selection waterfall (number of observations). Exclusion of the observations of the 2 banks that bankrupted before the 1876 crisis from the sample; the 2 banks that had their accounts in another currency; and the 4 banks which were incorporated after the crisis.



Figure 3 - Incorporation of new banks (number of banks). Number of banks established in each year between 1844 and 1876 and total number of banks which were active in the advent of the crisis. There was a clear boom of new banks in the three years before 1876 crisis, where the total number of active banks increased from 16 to 54.



Figure 4 - Number of new banks created before the 1876 crisis and bankrupt banks after the 1876 crisis. In 1876, there was an observable decrease in the number of established banks and, in the following years, no more new banks were incorporated. In fact, after 1876, there were solely bankruptcies, namely 11 bank failures.

At this point, it was considered interesting to use a measure for bank competition, namely the Herfindahl-Hirschman Index (HHI), for each year to analyze its evolution. It was computed as the sum of squared market shares, defined as each bank's deposits to total deposits in the market ratio as in Berger & Hannan (2013). This market concentration index is plotted in Figure 5 and, in fact, there was a huge decrease of approximately 87.4% between 1858 and 1877, which is the year after crisis and where we can find the minimum value.



Figure 5 - Herfindahl-Hirschman Index (Market Concentration) Evolution between 1858 and 1887

Furthermore, in the EDA, it was identified a significant decrease on the levels of deposits of all banks after the 1876 crisis, reflecting the occurrence of bank runs described in the report from Bank of Portugal, prepared for the Board of Shareholders' General Meeting on  $29^{\text{th}}$  August 1876 (Figure 6). In this context, I also plotted the total deposits for all banks throughout the crisis year – 1876 – and, as it possible to see in Figure 7, the value decreases from 25042 to 14729 *Contos de Réis*, representing a 41.2% drop.



Figure 6 - Evolution of deposits of all active banks and number of active banks between 1858 and 1887



Figure 7 - Evolution of deposits of all active banks in 1876

Lastly, it was prepared a map with the bank locations (Figure 8) to look into the regional distribution, establishing a distinction between the North (banks north of river Mondego) and the South (banks south river Mondego, including Azores and Madeira archipelagos). It was used this distinction because it is present in the Bank of Portugal report mentioned above and, in fact, apart from Lisbon, there was more investment in

Spanish Government Bonds in the North. Besides, the banks which went bankrupt are flagged and it is observable there were 8 bankruptcies in the North versus 3 in the South, namely in Lisbon.



Figure 8 - Portugal map with number of banks by county and region (North and South)

Accordingly, I used all the entries available in the document "Annaes de Estatística – Estatística Bancária" in order to construct variables which reflect the main characteristics identified as critical to the occurrence of bankruptcies in the literature. Previous studies found that bankruptcies can be predicted by low equity capital, low asset quality and illiquidity. So, I decided to use the realized capital as well as the deposits, the total credit and the collateralized loans values available in the dataset to construct the variables collateralized loans to total credit ratio, total credit to deposits ratio and capital to total credit ratio. This way, total credit to deposits ratio is used as a proxy for liquidity and collateralized loans to total credit ratio as an indicator for asset quality. In fact, according to previous findings, a bank with a high value of total credit to deposits ratio is more prone to bankrupt since its liquidity may not be sufficient to address unexpected funding requirements. Moreover, a bank with a low weight of collateralized loans on total credit, displays lower asset quality, having higher likelihood of bankruptcy.

Regarding capital, including its logarithm in the models provides an approximation for banks' size. In general, smaller banks have more propensity to bankrupt during a crisis, according to the "too big to fail" view. Furthermore, the cash to capital ratio and the capital to total credit ratio give information on the banks' value. The smaller these ratios, the larger the probability of a bank failing because they mean the bank is less liquid and is less capitalized.

In addition, since in the literature there is evidence that new banks can be compared to start-ups in other industries and, in fact, they are more prone to bankruptcy than older firms, the age of a bank, *id est* the years on activity, is also studied in this thesis.

Finally, the annual change rate of deposits and the annual change rate of total credit may be also relevant to be investigated in this thesis in order to capture if the variations in those bank characteristics are determinant to bank failures.

Although there is evidence in the literature that low profitability, cost inefficiency and/or poor management are critical on bankruptcies of banks, the source document does not provide that information, so they are not considered.

In this sense, to examine whether the variables described above and displayed in Table 1 are determinant to increase or decrease the probability of bankruptcy, the following logit models were estimated.

Variable	Definition								
Bankruptcy	Dummy variable that takes the value of 1 when the bank bankrupts between 1876 and 1887, and 0 otherwise								
Incapital	Natural logarithm of realized capital								
cash/capital	Cash to capital ratio								
$\Delta$ t.credit	Annual change rate of total credit								
coll.loans/t.credit	Collateralized loans to total credit ratio								
t.credit/deposits	Total credit to deposits ratio								
$\Delta$ deposits	Annual change rate of deposits								
capital/t.credit	Capital to total credit ratio								
age	Bank' years of activity								
north	Dummy variable that takes the value of 1 if it the bank is located in the North of Portugal, and 0 otherwise								

Table 1 - Variables definition

Firstly, since during the period 1873-1875 there was a boom of new banks, crosssectional univariate Logit Models (1), (2) and (3) for those 3 years were estimated to complete the exploratory data analysis performed. This way, it is possible to assess the main bank characteristics that could have led to bankruptcies in that period, dealing with the shortage of degrees of freedom in a model which includes all of the variables described above, given the small size of the sample. In this context, it was considered as bankrupt, a bank that went bankrupt between 1876 and 1887 and, consequently, ceased its activity. For each year, 7 univariate models were estimated using each one of the variables logarithm of capital (*lncapital*), cash to capital ratio (*cash/capital*), annual change rate of total credit ( $\Delta$  *t.credit*), collateralized loans to total credit ratio (*coll.loans/t.credit*), total credit to deposits ratio (*t.credit/deposits*), annual change rate of deposits ( $\Delta$  *deposits*) and capital to total credit ratio (*capital/t.credit*) as the dependent variable to assess the significance of bank characteristics in the years before crisis to explain banks' failure:

- (I)  $Bankruptcy_i = \alpha + \beta_1 lncapital_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$
- (II)  $Bankruptcy_i = \alpha + \beta_1 cash/capital_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$
- (III)  $Bankruptcy_i = \alpha + \beta_1 \Delta t. credit_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$
- (IV)  $Bankruptcy_i = \alpha + \beta_1 coll. loans/t. credit_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$
- (V)  $Bankruptcy_i = \alpha + \beta_1 t. credit/deposits_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$
- (VI)  $Bankruptcy_i = \alpha + \beta_1 \Delta deposits_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$
- (VII)  $Bankruptcy_i = \alpha + \beta_1 capital/t. credit_i + \varepsilon_{i,t}$ , with  $i = \{1873; 1874; 1875\}$

Secondly, given that, in the exploratory data analysis performed, it was visible that the banks which failed were incorporated during the boom before crisis and, consequently, were substantially younger, it was decided to estimate an univariate logit model with panel data, using age as the dependent variable and including random-effects  $\delta_i$ .

# (4) $Bankruptcy_{i,t} = \alpha + \delta_i + \beta_1 age_{i,t} + \varepsilon_{i,t}$

Thirdly, following the previous model, it was made a survival analysis by plotting the Kaplan-Meyer non-parametric estimators forecasting the banks' survival time (Calomiris & Mason, 1997). This analysis intended to study the linkage between *age* and the dichotomy survival *vs* bankruptcy during this timeframe.

Lastly, it was estimated a logit model using panel data as Martin (1977), comprising the variables described above (Table 1). The annual change rates of total credit and of deposits were used to control for variations over time. Given that the bankruptcy probability may display regional effects, it was included a dummy for the region, drawing a distinction between banks in the North region and in the South region (includes archipelagoes Azores and Madeira) since there was a more intensively speculative environment in the North concerning the Spanish Government bonds. Furthermore, the model was estimated with random-effects  $\delta_i$  because there is a time-invariant variable (north) in the model. Hence, the following logit model was estimated to assess the probability of the bank *i* bankrupt in time *t*:

(5)  $Bankruptcy_{i,t} = \alpha + \delta_i + \beta_1 lncapital_{i,t} + \beta_2 cash/capital_{i,t} + \beta_3 \Delta t. credit_{i,t} + \beta_4 coll. loans/t. credit_{i,t} + \beta_5 t. credit/deposits_{i,t} + \beta_6 \Delta deposits_{i,t} + \beta_7 \Delta capital/t. credit_{i,t} + \beta_8 age_{i,t} + \beta_9 north_t + \varepsilon_{i,t}$ 

The descriptive statistics of these variables are explained in Table 2, where there is also a distinction between banks that went bankrupt and banks which did not (Panel A) as well as a division between banks in the North and banks in the South (Panel B). Table 2, in both panels, also reports the p-values of the parametric t-tests performed on the differences in the variables' means between the two groups.

Table 2 – Summary statistics. This table reports the mean, the median, the standard deviation, the minimum and the maximum values of the variables logarithm of capital (Incapital), cash to capital ratio (cash/capital), annual change rate of total credit (( $\Delta$  t.credit), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits), annual change rate of deposits ( $\Delta$  deposits), capital to total credit ratio (capital/t.credit), age and the dummy north for the full sample and for a division between groups. Panel A reports those values for no bankrupt banks and for bankrupt banks and Panel B for banks in the South and banks in the North. Both Panels include the differences in the mean values between the two set of groups as well as the respective t-tests. The symbols \*, \*\*, and \*\*\* illustrate 10%, 5%, and 1% significance levels, respectively.

Variable	All banks						No Bankrupt Banks						Bankrupt Banks						Difference
variable	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Mean
Bankruptcy	835	0.013	0.000	0.114	0.000	1.000													
lncapital	650	20.428	20.500	1.361	16.159	22.920	646	20.437	20.500	1.357	16.159	22.920	4	18.861	18.767	1.039	17.738	20.173	1.576**
cash/capital	650	0.149	0.095	0.189	0.000	2.057	646	0.150	0.096	0.190	0.000	2.057	4	0.038	0.022	0.047	0.001	0.105	0.112
$\Delta$ t.credit	768	0.292	-0.001	1.964	-1.000	29.628	758	0.302	0.001	1.975	-0.945	29.628	10	-0.051	-0.737	0.418	-1.000	0.076	0.353
coll.loans/t.credit	823	0.277	0.168	0.310	0.000	1.000	813	0.276	0.167	0.310	0.000	1.000	10	0.332	0.213	0.335	0.000	0.897	-0.057
t.credit/deposits	792	9.010	2.444	49.195	0.000	1144.036	783	8.685	2.422	48.388	0.000	1144.036	9	37.277	2.998	97.545	0.235	297.061	-28.593*
$\Delta$ deposits	739	0.383	0.060	4.159	-1.000	107.980	730	0.240	0.061	1.265	-1.000	14.431	9	11.961	-0.004	36.010	-1.000	107.980	-11.721***
capital/t.credit	639	2.125	1.500	2.275	0.052	24.255	635	2.072	1.490	2.054	0.052	24.255	4	10.642	9.539	10.535	0.406	23.086	-8.571***
age	835	12.007	10.000	9.160	1.000	44.000	824	12.086	10.000	9.186	1.000	44.000	11	6.091	5.000	3.833	1.000	13.000	5.995**
north	835	0.566	1.000	0.496	0.000	1.000	824	0.564	1.000	0.496	0.000	1.000	11	0.727	1.000	0.467	0.000	1.000	-0.163

Panel	B
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Variable	All banks						Banks in the South						Banks in the North						Difference
variable	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median S	Std. Dev.	Min	Max	Mean
Bankruptcy	835	0.013	0.000	0.114	0.000	1.000	362	0.008	0.000	0.091	0.000	1.000	473	0.017	0.000	0.129	0.000	1.000	-0.009
lncapital	650	20.428	20.500	1.361	16.159	22.920	241	20.647	20.552	1.539	16.159	22.803	409	20.298	20.500	1.227	16.265	22.920	0.348***
cash/capital	650	0.149	0.095	0.189	0.000	2.057	241	0.181	0.983	0.234	0.000	2.057	409	0.131	0.095	0.154	0.000	1.520	0.050***
$\Delta$ t.credit	768	0.292	-0.001	1.964	-1.000	29.628	336	0.358	0.008	2.207	-0.945	29.628	432	0.240	-0.009	1.753	-1.000	24.620	0.117
coll.loans/t.credit	823	0.277	0.168	0.310	0.000	1.000	358	0.375	0.244	0.373	0.000	1.000	465	0.201	0.136	0.224	0.000	1.000	0.174***
t.credit/deposits	792	9.010	2.444	49.195	0.000	1144.036	332	14.146	1.695	74.864	0.000	1144.036	460	5.302	2.792	9.808	0.041	108.610	8.844
$\Delta$ deposits	739	0.383	0.060	4.159	-1.000	107.980	311	0.263	0.081	1.394	-1.000	14.431	428	0.469	0.046	5.335	-1.000	107.980	-0.206
capital/t.credit	639	2.125	1.500	2.275	0.052	24.255	237	2.227	1.545	2.123	0.052	15.492	402	2.065	1.478	2.360	0.149	24.255	0.162
age	835	12.007	10.000	9.160	1.000	44.000	362	14.122	11.000	10.798	1.000	44.000	473	10.389	9.000	7.282	1.000	33.000	3.733***
north	835	0.566	1.000	0.496	0.000	1.000													

In Table 2, the aggregate data display that 1.3% of the observations correspond to the last activity year of the banks which went bankrupt during the time under analysis. On average, banks are 12 years old. The mean capital (*lncapital*) is 745 *Contos de Réis* (exponential of 20.428), the mean cash to capital ratio (*cash/capital*) is 14.9% and the mean capital to total credit ratio (*capital/t.credit*) is 2.125. The mean collateralized loans (*coll.loans/t.credit*) are 27.7% of the total credit, reflecting a lower reliance on secured loans, which are less risky. The mean total credit to deposits (*t.credit/deposits*) ratio is 9.010, evidencing the significant liquidity risks these banks were facing. Regarding the annual change rates, for total credit ( $\Delta$  *t.credit*) it is, on average, 29.2% with a median of -0.1% and for deposits ( $\Delta$  *deposits*) it is, on average, 38.3% with a median of 6.0%, thus showing the expansionary period lived in the financial system before the crisis.

In Table 2, Panel A, one may acknowledge that the capital (*lncapital*) is, on average, lower for bankrupt banks (155 *Contos de Réis*, the exponential of 18.861) than for banks which did not go bankrupt (751 *Contos de Réis*, the exponential of 20.437). Furthermore, the difference in mean between the two groups is significant at a 5% level. Regarding the ratio of total credit to deposits (*t.credit/deposits*), the mean is substantially higher for bankrupt banks (37.277 *vs* 8.685) and the difference is statistically significant at a 10% level. Besides, the differences on the means of annual change rate of deposits ( $\Delta$  *deposits*) and capital to total credit (*capital/t.credit*) between groups are significant at 1% level. The annual change rate of deposits ( $\Delta$  *deposits*) among bankrupt banks is, on average, 11.961, which is substantially higher than 0.240 from no bankrupt banks. Concerning the capital to total credit ratio (*capital/t.credit*), bankrupt banks display a mean of 10.462 and the no bankrupt banks a mean of 1.490. Finally, the difference on the *age* means between the two groups reveals to be significant at a 5% level and it is lower for bankrupt banks (6.091) than for no bankrupt banks (12.086).

In Table 2, Panel B, it is possible to see that there are more bankrupt banks in the North (0.017) than in the South (0.008). In addition, banks in the South (929 *Contos de Réis*, exponential of 20.647) have, on average, significantly higher capital (*lncapital*) than banks in the North (655 *Contos de Réis*, exponential of 20.298) and this difference is significant at 1% level. Moreover, on average, the cash to capital ratio (*cash/capital*) is significantly different between South and North banks at a 1% level, being higher for the former (0.181) comparing to the latter (0.131). The mean collateralized loans are 37.5% of the total credit (*coll.loans/t.credit*) for South banks and 20.1% for North banks, being

the latter more exposed to risk. This difference also exhibits significance at a 1% level. Lastly, the difference on the *age* means between the two groups is also significant at 1% level, given that the mean of *age* for South banks is 14.122, being considerably higher than the mean value of 10.389 from North banks.

# V. Empirical Findings

## *i.* Univariate cross-section logit models

The first univariate cross-section models were estimated for the three years before crisis (1873, 1874 and 1875) using the variables logarithm of capital (*lncapital*), cash to capital ratio (*cash/capital*), annual change rate of total credit ( $\Delta$  *t.credit*), collateralized loans to total credit ratio (*coll.loans/t.credit*), total credit to deposits ratio (*t.credit/deposits*), annual change rate of deposits ( $\Delta$  *deposits*) and capital to total credit ratio (*capital/t.credit*) to assess if the bank characteristics in those years are significant to explain whether a bank goes bankrupt or not between 1876 and 1887. Table 3 comprises the results for those models, displaying the coefficients and the corresponding two-tailed p-values, which are obtained through White's method of correcting standard errors for heteroskedasticity; the Wald test and the Pseudo R<sup>2</sup>. Since these models were constructed with the aim of observing the variables' significance and their coefficients' signs, it was decided for sake of brevity to not provide the marginal effects.

The univariate Logit Models (1) - I, II, IV, V and VII, each one using as independent variable logarithm of capital (*lncapital*), cash to capital ratio (*cash/capital*), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits) and capital to total credit ratio (capital/t.credit), respectively, were estimated for 1873. The univariate Logit Models (1) – III and VI which include the annual change rate of total credit ( $\Delta$  *t.credit*) and the annual change rate of deposits ( $\Delta$  *deposits*) respectively, were not estimated for 1873 because the two banks which went bankrupt in the crisis were created in this year, not being possible to compute annual change rates. Logit Models (1) - I, IV and V estimation reveals that capital (Incapital) and collateralized loans to total credit ratio (coll.loans/t.credit) are significant at a 10% level and total credit to deposits ratio (t.credit/deposits) is significant at a 5% level, respectively. In addition, their coefficients exhibit the expected signs as the probability of bankruptcy varies negatively with the capital, *lncapital*, (-0.674) and with the weight of collateralized loans on total credit, coll.loans/t.credit, (-11.294) and positively with the weight of total credit on deposits, t.credit/deposits, (0.608). Cash to capital ratio (cash/capital) and capital to total credit ratio (capital/t.credit) are not statistically significant in the Models (1) – II and VII, respectively.

For 1874, it is already possible to estimate Logit Models (2) – III and VI as there are data on the annual changes. However, both annual change rate of total credit ( $\Delta$  *t.credit*) and annual change rate of deposits ( $\Delta$  *deposits*) are not significant to explain bankruptcy. Moreover, Logit Models (2) - I, IV and V no longer exhibit significant capital (Incapital), collateralized loans to total credit ratio (coll.loans/t.credit) and total credit to deposits ratio (*t.credit/deposits*), respectively. And the sign of the total credit to deposits ratio (t.credit/deposits) coefficient is, in this case, positive. Nonetheless, capital (*lncapital*) and collateralized loans to total credit ratio (*coll.loans/t.credit*) coefficients still display the awaited signs (-0.226 and -1.375). In their turn, Models (2) – II and VII reveal that cash to capital ratio (cash/capital) and capital to total credit ratio (capital/t.credit) in 1874 are significant to predict bankruptcy at 1% and 5% levels, respectively. The estimator sign for cash to capital ratio (*cash/capital*) is negative (-5.929) as expected, meaning that a more liquid bank is more likely to survive. The estimator sign for capital to total credit ratio (capital/t.credit) is positive (1.618) and it was expected to be negative since previous literature indicate that a more capitalized bank is less likely to bankrupt.

Using 1875 data, only the Model (3) – VII exhibits a significant predictor at 10% level, namely capital to total credit ratio (capital/t.credit), but with the sign contrary to what was expected (0.729). The annual change rates of total credit ( $\Delta$  *t.credit*) and of deposits ( $\Delta$  deposits) are not significant in the Logit Models (3) – III and VI as well as the logarithm of capital (*lncapital*), cash to capital ratio (*cash/capital*), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits) in the Models (3) - I, II, IV and V, respectively. The puzzling part is the fact that all the coefficients of the estimators cash to capital ratio (cash/capital), collateralized loans to total credit ratio (coll.loans/t.credit) and total credit to deposits ratio (t.credit/deposits) have a sign different from what was expected (0.392, 0.038, - 0.050). In fact, according to the literature, it would be expected to have negative coefficients in cash to capital ratio (cash/capital) and collateralized loans to total credit ratio (coll.loans/t.credit) since it is argued that a bank having more liquidity and assets with more quality is less likely to bankrupt. Also, it would be predicted to have a positive coefficient in the total credit to deposits ratio (t.credit/deposits) because, in general, a bank with a high value in this measure is more prone to bankrupt as it is less liquid.

Table 3 – Univariate cross-section logit models estimation. This table reports the results for the univariate logit models (1) - I, II, IV, V, VII; (2) - I, II, III, IV, V, VI, VII and (3) - I, II, III, IV, V, VI, VII of the probability of bankruptcy using the variables logarithm of capital (lncapital), cash to capital ratio (cash/capital), annual change rate of total credit ( $\Delta$  t.credit), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits), annual change rate of deposits ( $\Delta$  deposits) and capital to total credit ratio (capital/t.credit) in 1873, 1874 and 1875, displaying the coefficients and the corresponding two-tailed p-values, which are obtained through White's method of correcting standard errors for heteroskedasticity; the Wald test and the Pseudo  $R^2$ .

			Model (1)		Logit Model (2)				Logit Model (3)					
	Variable			1873		1874				1875				
		Coef.	Obs.	Wald chi <sup>2</sup>	Pseudo R <sup>2</sup>	Coef.	Obs.	Wald chi	<sup>2</sup> Pseudo R <sup>2</sup>	Coef.	Obs.	Wald chi <sup>2</sup>	Pseudo R <sup>2</sup>	
I	Intercept Incapital	11.666 0.115 -0.674 0.054	16	0.054	0.117	1.385 0.682 -0.226 0.145	24	0.145	0.017	0.761 0.868 -0.016 0.472	40	0.472	0.009	
п	Intercept cash/capital	-1.818 0.082 -0.058 0.859	16	0.859	0.002	-2.406 0.031 -5.929 0.008	24	0.008	0.053	-2.566 0.007 0.392 0.941	40	0.941	0.000	
ш	Intercept ∆ t.credit		1	N.A.		-2.712 0.023 2.090 0.166	17	0.166	0.172	-1.834 0.005 -0.591 0.155	27	0.155	0.047	
IV	Intercept coll.loans/t.credit	-0.037 0.754 -11.294 0.098	17	0.098	0.212	-1.787 0.008 -1.375 0.119	28	0.119	0.019	-1.421 0.001 0.038 0.970	51	0.970	0.000	
v	Intercept t.credit/deposits	-3.603 0.000 0.608 0.025	16	0.025	0.152	-2.072 0.001 -0.010 0.753	28	0.753	0.001	-1.217 0.006 -0.050 0.565	49	0.565	0.004	
VI	Intercept ∆ deposits		1	N.A.		-1.908 0.016 -0.081 0.595	16	0.595	0.003	-2.002 0.002 -0.061 0.599	27	0.599	0.004	
VII	Intercept capital/t.credit	0.080 0.964 -1.783 0.177	13	0.178	0.118	-1.175 0.434 -1.618 0.038	22	0.038	0.118	-3.942 0.003 0.729 0.062	38	0.062	0.161	

## *ii.* Univariate panel data logit model

In this subsection, it is tested if the age, defined as the years under activity of each bank, is significant to explain the probability of bankruptcy, using panel data. It was not estimated a cross-section model because all the banks which went bankrupt after 1876 and have information between 1873 and 1876, were established in the latter period. Therefore, the model ultimately predicts bankruptcy perfectly and, in this sense, it was only estimated a model using panel data. Table 4, which compiles this model's results, shows that the age is statistically significant to explain banks' bankruptcy at a 5% level. Furthermore, it was performed the Wald test which reveals that the model is significant at a 5% level. These results may illustrate that younger banks have higher default risks when comparing to older ones.

Table 4 - Univariate panel data logit model (4) estimation. This table reports the results for the univariate logit models of the probability of bankruptcy using the variable age, displaying the coefficients and the corresponding two-tailed p-values, which are obtained through White's method of correcting standard errors for heteroskedasticity; the log likelihood and the Wald test.

	Panel Data -
Variable	Logit Model (4)
	Coefficients
Intercept	-3.188
	0.000
age	-0.134
	0.036
Number of obs	835
Number of groups	54
Log likelihood	-55.150
Wald chi <sup>2</sup> (9)	4.39
$Prob > chi^2$	0.036

### iii. Survival Analysis | Kaplan-Meier Estimates

In this division, it is presented a non-parametric technique for survival analysis, namely Kaplan-Meier estimation, naturally following the study conducted in the previous subsection. In fact, at this point, this analysis turned out to be interesting given the statistically significance of *age* in Model (4). The use of this method allows to obtain the Kaplan-Meier estimator of the survival function of banks and to plot it into a graph. Additionally, it was prepared an analysis dividing the sample in two groups - banks from the North and banks from the South – to assess the survival time differences between them. It was performed the Log-rank test for equality of North and South survivor functions to test this proposition and it reveals that the difference between the two groups is insignificant.

Croups	Log-rank test for equality of survivor functions								
Groups	Events observed	Events expected							
South	3	4.610							
North	8	6.390							
Total	11	11							
chi2(1)		0.980							
<i>cm2</i> (1)		0.323							

Table 5 – Log-rank test for equality of survivor functions (p-value in italic)

Figure 9 illustrates that banks with an *age* superior to 12 years survive during the crisis and this may evidence that the years under activity of a bank are potentially crucial to survive crises, especially when it is created under a deregulated context. Therefore, one may argue that when a bank becomes older, its default risk is likely to decrease, on average.



Figure 9 – Kaplan-Meier survival function estimates

Figure 10 indicates that, in the North, the banks which went bankrupt were under activity for 10 years or less. But, in the South, the banks which failed had an age between 7 and 12 years. This evidence may express that the incorporation of banks in the North during the years before crisis, which benefited from the deregulated setting, were created under a more speculative environment than South banks what is probably linked to faster bankruptcies in the North.



Figure 10 - Kaplan-Meier survival function estimates for banks in the South and North

## iv. Panel data logit models

The next step was to estimate the Logit Model (5) comprising all the variables previously studied, using panel data. The estimation results are displayed in Table 6, including the coefficients, the marginal effects and their respective p-values, computed based on White's method to correct standard errors for heteroskedasticity. Besides, Table 6 contains the Wald test which indicates that this model, globally, is not significant. Further, all the predictors estimated reveal to be insignificant in this model.

Table 6 – Panel data logit model (5) estimation. This table reports the results for the logit model (5) of the probability of bankruptcy using the variables logarithm of capital (lncapital), cash to capital ratio (cash/capital), annual change rate of total credit ( $\Delta$  t.credit), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits), annual change rate of deposits ( $\Delta$  deposits), capital to total credit ratio (capital/t.credit), age and the dummy north without winsorization, displaying the coefficients and the marginal effects and the corresponding two-tailed p-values; the Wald test (p-value in italic) and the log likelihood.

	Panel Data -	Logit Model (5)						
Variable	No Wins	No Winsorization						
	Coef.	Marginal effects						
Intercept	114.105							
	0.211							
lncapital	-6.369	-0.020						
	0.211	0.352						
cash/capital	-35.031	-0.112						
	0.194	0.345						
$\Delta$ <i>t.credit</i>	-13.866	-0.045						
	0.147	0.316						
coll.loans/t.credit	4.831	0.016						
	0.374	0.448						
t.credit/deposits	0.010	0.000						
	0.213	0.364						
$\Delta$ deposits	1.055	0.003						
	0.292	0.360						
capital/t.credit	0.537	0.002						
	0.187	0.419						
age	-0.950	-0.003						
	0.122	0.242						
north	0.358	0.001						
	0.858	0.858						
Number of obs	564							
Number of groups	48							
Log likelihood	-6.152							
Wald chi <sup>2</sup> (9)	3.72							
$Prob > chi^2$	0.929							

Following these results and considering that the sample used kept outliers, it was decided to perform an 80% winsorization. Although, it seems odd to winsorize in those terms a small sample as the present one, it has in fact extreme figures, possibly biasing the results, which are not treated when performing a 98% or even a 90% winsorization. Additionally, one should not discard that this dataset not only was collected initially by hand in the 19<sup>th</sup> century, but also it was manually uploaded to be manipulated in this study. Obviously, these facts could potentially have produced errors, despite the careful triple validation procedure.

Table 7 contains a summary of the descriptive statistics for the 80% winsorized sample, including the differences in the variables' means between groups and the corresponding t-tests in both panels. The aggregate data still displays that 1.3% of the observations correspond to the last activity year of the banks which went bankrupt during the time under analysis. The mean capital (*lncapital*) is, in this sample, 765 *Contos de Réis* (exponential of 20.456) comparing to 745 *Contos de Réis* (exponential of 20.456) comparing to 745 *Contos de Réis* (exponential of 20.428) from the initial sample; the mean cash to capital ratio (*capital*) is 1.851 comparing to 14.9% and the mean capital to total credit ratio (*capital/t.credit*) is 1.851 comparing to 2.125. The mean collateralized loans (*coll.loans/t.credit*) are 27.7% of the total credit as in the initial sample and the mean total credit to deposits ratio (*t.credit/deposits*) is 3.943, significantly lower than 9.010 from the initial sample. Regarding the annual change rates, for total credit ( $\Delta$  *t.credit*) it is, on average, 3.4% with a median of -0.1% and for deposits ( $\Delta$  *deposits*) it is, on average, 8.5% with a median of -0.1% for total credit ( $\Delta$  *t.credit*) and 38.3% with a median of 6.0%, for deposits ( $\Delta$  *deposits*).

In Table 7, Panel A, one may observe that the capital (*lncapital*) is still, on average, lower for bankrupt banks (772 *Contos de Réis*, the exponential of 20.465) than for banks which did not bankrupt (183 *Contos de Réis*, the exponential of 19.024). Furthermore, the difference in mean between the two groups is significant at a 5% level. The cash to capital ratio (*cash/capital*) means' difference is, in this sample, significant at 10% level, where the mean for no bankrupt banks is higher (0.125) than for bankrupt banks (0.044). The annual change rate of total credit ( $\Delta t.credit$ ) means' difference, in this sample, also turns out to be significant at a 1% level. On average,  $\Delta t.credit$  is 3.8% for no bankrupt banks and -22.5% for bankrupt banks. Regarding the weight of total credit on deposits (*t.credit/deposits*), the difference is no longer statistically significant at a 10%

level as in the initial sample. Besides, the differences on the means of  $\Delta$  *deposits* are not significant as well. Concerning the capital to total credit ratio (*capital/t.credit*), bankrupt banks display a mean of 3.109 and no bankrupt banks a mean of 1.843, being their difference significant at a 5% level. Finally, the *age* mean values and their difference remains equal to the initial sample.

In Table 7, Panel B, banks in the South (907 *Contos de Réis*, exponential of 20.625) have, on average, significantly higher capital (*lncapital*) than banks in the North (692 *Contos de Réis*, exponential of 20.356) and this difference is also significant at a 1% level in this sample. Also, on average, the cash to capital ratio (*cash/capital*) is significantly different between South and North banks at a 1% level, being higher for the former (0.138) comparing to the latter (0.116). The annual change rate of total credit ( $\Delta$  *t.credit*) means' difference in this dataset is significant at a 5% level, being on average superior for South banks (0.057) than for North banks (0.017). The mean collateralized loans (*coll.loans/t.credit*) are 37.5% of the total credit for South banks and 20.1% for North banks as in the first sample and their difference also exhibits significance at a 1% level. Moreover, the difference in the means of capital to total credit ratio (*capital/t.credit*) is larger for South banks (1.959) than four North banks (1.787). Lastly, the statistics for the *age* remain equal to the ones from the initial sample.

Table 7 - Summary statistics. This table reports the mean, the median, the standard deviation, the minimum and the maximum values of the variables logarithm of capital (Incapital), cash to capital ratio (cash/capital), annual change rate of total credit ( $\Delta$  t.credit), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits), annual change rate of deposits ( $\Delta$  deposits), capital to total credit ratio (capital/t.credit), age and the dummy north for the 80% winsorized sample and for a division between groups. Panel A reports those values for no bankrupt banks and for bankrupt banks and Panel B for banks in the South and banks in the North. Both Panels include the differences in the mean values between the two set of groups as well as the respective t-tests. The symbols \*, \*\*, and \*\*\* illustrate 10%, 5%, and 1% significance levels, respectively.

Panel A	80% Wi	insorization	!																			
Variabla	All banks							No Bankrupt Banks							Bankrupt Banks							
variable	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Mean			
Bankruptcy	835	0.013	0.000	0.114	0.000	1.000																
lncapital	650	20.456	20.500	1.146	18.389	22.004	646	20.465	20.500	1.142	18.389	22.004	4	19.024	18.767	0.836	18.389	20.173	1.440**			
cash/capital	650	0.124	0.095	0.096	0.021	0.308	646	0.125	0.096	0.096	0.021	0.308	4	0.044	0.026	0.041	0.021	0.105	0.080*			
$\Delta$ t.credit	768	0.034	-0.001	0.263	-0.347	0.558	758	0.038	0.001	0.262	-0.347	0.558	10	-0.225	-0.347	0.172	-0.347	0.076	0.262***			
coll.loans/t.credit	823	0.277	0.168	0.310	0.003	1.000	813	0.276	0.167	0.310	0.003	1.000	10	0.333	0.213	0.334	0.003	0.897	-0.057			
t.credit/deposits	792	3.943	2.444	4.028	0.483	13.709	783	3.924	2.422	4.010	0.483	13.709	9	5.620	2.998	5.399	0.483	13.709	-1.696			
$\Delta$ deposits	739	0.085	0.060	0.320	-0.415	0.684	730	0.085	0.061	0.319	-0.415	0.684	9	0.091	-0.004	0.418	-0.415	0.684	-0.006			
capital/t.credit	639	1.851	1.500	1.016	0.774	4.038	635	1.843	1.490	1.009	0.774	4.038	4	3.109	3.811	1.571	0.774	4.038	-1.266**			
age	835	12.007	10.000	9.160	1.000	44.000	824	12.086	10.000	9.186	1.000	44.000	11	6.091	5.000	3.833	1.000	13.000	5.995**			
north	835	0.566	1.000	0.496	0.000	1.000	824	0.564	1.000	0.496	0.000	1.000	11	0.727	0.000	0.467	0.000	1.000	-0.163			

Panel B	80% W	insorization																	
Variable			Al	l banks					Banks i	n the Sout	h				Banks in	the North	l		Difference
	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Obs	Mean	Median	Std. Dev.	Min	Max	Mean
Bankruptcy	835	0.013	0.000	0.114	0.000	1.000	362	0.008	0.000	0.091	0.000	1.000	473	0.017	0.000	0.129	0.000	1.000	-0.009
lncapital	650	20.456	20.500	1.146	18.389	22.004	241	20.625	20.552	1.210	18.389	22.004	409	20.356	20.500	1.095	18.389	22.004	0.270***
cash/capital	650	0.124	0.095	0.096	0.021	0.308	241	0.138	0.098	0.106	0.021	0.308	409	0.116	0.095	0.088	0.021	0.308	0.023***
$\Delta$ t.credit	768	0.034	-0.001	0.263	-0.347	0.558	336	0.057	0.008	0.278	-0.347	0.558	432	0.017	-0.009	0.249	-0.347	0.558	0.040**
coll.loans/t.credit	823	0.277	0.168	0.310	0.003	1.000	358	0.375	0.244	0.373	0.003	1.000	465	0.201	0.136	0.224	0.003	1.000	0.174***
t.credit/deposits	792	3.943	2.444	4.028	0.483	13.709	332	3.747	1.695	4.342	0.483	13.709	460	4.084	2.792	3.784	0.483	13.709	-0.337
$\Delta$ deposits	739	0.085	0.060	0.320	-0.415	0.684	311	0.103	0.081	0.325	-0.415	0.684	428	0.071	0.046	0.317	-0.415	0.684	0.032
capital/t.credit	639	1.851	1.500	1.016	0.774	4.038	237	1.959	1.545	1.116	0.774	4.038	402	1.787	1.478	0.948	0.774	4.038	0.172**
age	835	12.007	10.000	9.160	1.000	44.000	362	14.122	11.000	10.798	1.000	44.000	473	10.389	9.000	7.282	1.000	33.000	3.733***
north	835	0.566	1.000	0.496	0.000	1.000													

Therefore, I estimated the same model using the sample with the outliers identified in all the variables winsorized. The estimation results are displayed in Table 8, including the coefficients, the marginal effects and their respective p-values, computed based on White's method to correct standard errors for heteroskedasticity. Besides, Table 8 includes the Log likelihood and the Wald chi<sup>2</sup>. Overall, the model is only significant at a 15% level based on Wald test. There is evidence that logarithm of capital (*lncapital*), total credit to deposits ratio (t.credit/deposits), capital to total credit ratio (capital/t.credit) and age are significant to explain bank failures at 1%, 5%, 10% and 5% levels, respectively. Additionally, these variables' coefficients feature the expected signs. Actually, the bankruptcy probability varies negatively with capital (*lncapital*) (-15.798), supporting the argument that more capitalized banks are healthier and they are more likely to survive in crises. One can also point out that capital levels reflect the banks' size and, consequently, bigger banks are less likely to bankrupt because of potentially receiving support in the case of a crisis, in line with a "too big to fail" view (Hovakimian & Kane, 2000). In reality, after the bank runs in 1876, the Portuguese Government bailed out some banks, through a 300,000 English Sovereigns loan granted by London, according to the report from the Board of Shareholders' General Meeting on 29th August 1876. The bankruptcy probability varies positively with the weight of total credit on deposits (*t.credit/deposits*) (1.617), which is consistent with the fact that, although banks may create additional supply through the deposit expansion multiplier, banks providing excessive amounts of credit without having an appropriate financial situation are more prone to fail during a crisis, especially when bank runs shorten the level of deposits. In its turn, the age coefficient estimate is negative (-2.658), indicating that the probability of banks failing varies oppositely with age. This finding suggests that newly-created banks are more susceptible of bankrupting in crises. As proposed earlier, this evidence may be related with the boom of new banks in the three years before the crisis, characterized by a deregulated environment with no comprehensive regulatory policies neither an established supervisor.

Regarding the marginal effects, they are only significant for the variables logarithm of capital (*lncapital*) and total credit to deposits ratio (*t.credit/deposits*) at a 5% level. When there is a one unit increase in the logarithm of capital (*lncapital*), the probability of bankruptcy decreases by 0.022. And when total credit to deposits ratio (*t.credit/deposits*) increases by one unit, the probability of bankruptcy increases by 0.002.

Capital to total credit ratio (*capital/t.credit*) and *age* are only significant at 15% and 20% levels, respectively.

Table 8 – Panel data logit model (6) estimation. This table reports the results for the logit model (6) of the probability of bankruptcy using the variables logarithm of capital (lncapital), cash to capital ratio (cash/capital), annual change rate of total credit ( $\Delta$  t.credit), collateralized loans to total credit ratio (coll.loans/t.credit), total credit to deposits ratio (t.credit/deposits), annual change rate of deposits ( $\Delta$  deposits), capital to total credit ratio (capital/t.credit), age and the dummy north with 80% winsorization, displaying the coefficients and the marginal effects and the corresponding two-tailed p-values; the Wald test (p-value in italic) and the log likelihood.

	Panel Data - Logit Model (6)									
Variable	80% Win	sorization								
	Coef.	Marginal effects								
Intercept	275.755									
	0.004									
lncapital	-15.798	-0.022								
	0.003	0.027								
cash/capital	-22.065	-0.031								
	0.580	0.636								
$\Delta$ t.credit	-21.995	-0.031								
	0.123	0.200								
coll.loans/t.credit	-7.108	-0.010								
	0.406	0.454								
t.credit/deposits	1.697	0.002								
	0.044	0.015								
$\Delta$ deposits	11.316	0.016								
	0.108	0.173								
capital/t.credit	5.288	0.007								
	0.057	0.190								
age	-2.658	-0.004								
	0.032	0.111								
north	2.323	0.003								
	0.642	0.644								
Number of obs	564									
Number of groups	48									
Log likelihood	-8.916									
Wald chi <sup>2</sup> (9)	13.70									
$Prob > chi^2$	0.133									

# VI. Conclusions

This dissertation studies the determinants of bankruptcies of banks in a deregulated context. A close investigation to the political and economic situation in the 19<sup>th</sup> century is important to understand the context in which a boom of new banks (startups) emerged. This was a period where regulatory policies diminished, leading to successive incorporations of more and more banks. Although it can be argued that deregulation results in more competition, which in general is positive for the economy, it also reduces the financial stability, as it is observable in the 1876 crises and in the associated 11 bankruptcies. In fact, these banks were all incorporated during the boom, being younger than the other banks that survived the crisis. Following this, in the present thesis there is evidence that the age, defined as the years under activity of a bank, may indicate its propensity to survive crises, *id est* the older a bank, the higher its propensity to survive crises. Nowadays, in a deregulated and highly competitive environment, where fintech start-ups are striving to disrupt the banking sector, this finding may be critical to alert for the need of supervision.

In addition, it is fundamental to examine the bank characteristics not only during the crisis, but also in the years before. According to this thesis' findings, the financial status of a bank is decisive to survive during a crisis in a setting where the banks are created without demanding regulation. Based on the panel data composed by 835 observations between 1858 and 1887, besides age, the capital amount, the weight of total credit on deposits and the capital to total credit ratio are also determinant for banks to survive crises. In fact, in this study, there is evidence that banks with more capital are more likely to survive them. This follows the line of reasoning which argues that healthier banks are more capitalized and, further, this may be linked to a "too big to fail" view, which claims that larger banks are more likely to survive crises as it is more feasible that they receive support during those times than smaller banks. Besides, a bank providing large amounts of credit, significantly higher than deposits, is more prone to bankrupt. It is truth that banks have a crucial role in the economy through the deposit expansion multiplier, but if their credit offer is unreasonable and unbalanced considering their financial status, this may lead to an unstainable situation, especially when bank runs shorten the level of deposits. These findings are consistent with what has been the focus of banks' supervisors, namely regarding capital requirements.

The identification of these determinants strengthens the importance of regulation on mitigating the risk of entering in banking crises and, broadly, in depression periods. For banking supervisors, this evidence may be relevant because the boom of new fintech start-ups without proper regulation we are living may potentially lead to a situation of successive bank failures as in the 1876 crisis. Therefore, it is imperative to set regulatory policies and to establish an effective supervision for the unregulated and fast-growing parts of the financial system.

## VII. Limitations

The estimated models include variables which assess the balance sheet composition and that are ultimately used as proxies for capital adequacy, asset quality and liquidity. These components alongside earnings and, more recently, management decision-making are part of the banks' supervision scope (CAMEL rating system). In this sense, it is important to mention that this study lacks data on banks' profitability and management quality, which are important drivers for the occurrence of bankruptcy (Cole & Gunther, 1995; Lane, Looney, & Wansley, 1986; Martin, 1977; Thomson, 1991; Whalen, 1991). Besides, efficiency and bank structure variables as well as quantitative information on the Portuguese economic conditions are relevant for bank failure analysis. Nevertheless, these figures were not available neither published in documents from Bank of Portugal Archive.

Moreover, although I analyzed monthly accounts from all the banking institutions in the year of the banking crisis, 1876, monthly data for all the years of the considered timeframe were not included in the study. In truth, this study only comprises annual banks' accounts data present in the document "Annaes de Estatística – Estatística Bancária" from Bank of Portugal Archive.

Additionally, there are some missing figures in the bank accounts due to a higher difficulty of collecting information in that century comparing to nowadays. There are also potential errors in the dataset because the figures present in the document referred above were manually collected in the 19<sup>th</sup> century and, in this dissertation, those figures were, in turn, manually introduced on a digital platform. Furthermore, while looking into the past is certainly helpful in shedding light into what might happen in the future, we should bear in mind the limitations of comparing banks 150 years ago to today's financial intuitions.

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# IX. Appendices

# *i.* Example of year accounts of a bank

				고극	20 —		401								21—				
			÷			QUADI	0 ¥.—1	lesumo das ope	rações annuaes da		cada um dos ban	icos, referiido a 3	t de dezembro						
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		1850	80:000	8.000:0405000	8.000.0005000	1005080	\$ ¶10	297:4155500	653:602,5600		1.472.0615378	2.753:0855173	8.691:061 578	1.993:570.5829	235:465 \$200	1.911:789 \$778	2.147:2015978	1.694:8585000	1659
		1860	\$0:000	S.000:0002000	8.000:0005000	100 5 000	6	291:5965100	500:2285000	4	1.051:230,5556	1.813:0515956	4.692:780,5152	2.227:4035745	228:0155000	2.080:125 \$671	2,314:4715271	1,859:5025000	1560
	2	1861	80:000	8,000:000.000	8.000:0005000	100.5000	6	397:8695000	863:2804000	50	719,950,5065	1.893:5965965	4:761:510/933	8.202:1985785	212:115\$100	9.120:9284970	2.363:3715370	1.509:1315000	1861
		1862	S0:000	8.000.0005000	8.000:0005000	100,5000	6	312:5593200	628:0114000	1	1.378:1905152	2.819:0935359	5.991:8655090	2.039:675 § 100	215:791\$800	2.231:9285900	2.477:720 5700	1.819:4615000	1862
		1863	80:000	8.000:0005000	8.000:0005000	100,5000	6 %a	319:7505500	168:0162000		1.117:0255039	2.205:7215882	6.074:6135691	1.528:323 5605	252:8375600	2.202:5005018	2.455:337\$613	1.689:2215000	1863
		1861	80.060	S.000:000 5000	8.000:0005000	100,5000	0	315:0132000	110-1355600		980:3335999	2.397:2625909	5.037:9105370	1.752:651 3765	252:8585600	1.797:6535168	9.030:511.0768	1,413:5105000	1861
		1860	50:000	8.000:000,000	8.608.0505000	100,5000	6	306:8935200	1.201:130.5000		758:603/5123	1.102:7785725	5.094:051 §182	2.201:2655461	250:1295000	1.117:211 5683	1.301:0(1)283	1.480:230,000	1500
		1800	80:000	8.000:0005000	8.000:0005000	100,5000	6	303:6035100	1.310:331 5000	10	798:7875188	2.307;0105386	4.793:773 5338	2.012:020 \$100	233:0152500	999:137 8019	1.520:0820010	1.575-5935000	1507
		1568	82:009	8.000:000.5000	8.000:000.600	100.5000	G	301:5675100	1.882:522.5000		\$17:2135510	2.431:1505910	4.690:7563/86	2.160:6889133	203:0319200	1.033:1039310	1.937(1005411	1.515:031.5000	1565
		1569	80:000	5.000:000 5000	8.000.000.5000	100,5000	6	307:8615200	2.331:268 5000		101:2020051	3.535:3020301	3 857-920 5909	1 \$75-501 \$900	937-8092000	1.911-331 5003	1,452:1935003	1.603:120.5000	1569
		1570	80:030	8.000:0005000	8.000:0005000	100,5000	6	308:5315800	2.601:510 5000		04236655266	a.5511193.010	3 155-511 5681	9 011-4595171	989-179 \$400	1.100:991.5546	1,400:4705916	1.700:065.5000	1870
	1	1871	\$0:000	8.000.000 5000	8.010:000.5000	100,5000	G	800:611,5000	2.407:006 \$000	8	002,0075457	8.620-814.8167	3.856:192.8393	1.830:9205841	231:455 \$600	1.198:097.5977	1.459:4525897	1.002:170 5000	1871
		1572	80:000	3.000;u00 <i>§</i> 000	8.600.0005000	160.5090	7	288:581,5100	1.250;232,5000.	1	897-6803519	2.431:199.5919	4,318:0335956	2.039:0203800	921:6705000	1.469:2445983	1.690:9145983	2.217:968 5000	1872
		1873	80:600	8.000:0005030	8.000:000.000	100,5000	7	309:0355200	818:572,5000		1.939:700.5196	2.497:308 5326	5.507:1135967	1.579:3235985	219:1225100	3.627:0175089	3.876:1095182	9.317:9055000	1873
		1874	80:000	8.000:0005000	8.000:0005000	100,5000	7	205:4625800	761:0905090		1.273:1105846	2.333:563.5646	6.279:1825615	1.001:7705186	235:5395000	2.506:9185467	2.712:517 5167	2.531:190,5000	1874
Banco de	e Portugal	1875	80:000	S.600:0005000	8.000:000.5000	100,5000	7	289:126,5000	372:531 5090		1.019:0825889	1.678:7435189	5.510:1665916	2.653:7095831	220:2025800	1.951:0505935	2.181:1535735	3.125:616,5000	1875
(Funda	ado em dezembro	1876	\$0:000	8.000:0005000	8.000:099,5000	100,5000	7	259:119.5 100	912:2405000		3.151:117.5050	4.655:806 \$150	5.772:920 \$164	9.621:140.5136	229:1055600	2.811:8515300	3.074:0465909	3.590:060,5000	1876
	ne 1810)	1877	89:000	5.000:0005000	8.000:000.5000	100,000	7	269:328.000	1.148:762.5000		1.519:1015317	8.237:5115317	4.673:8505296	2.057:0865186	209:1015200	1.893:5185319	2.107:9235010	4.079:518 5000	1877
		1578	89:000	8.000:0005000	8.000:0005000	100,5000	6	266:5155000	3.115:710.000		1.590.9985850	4.973:2565850	4.453:2655803	1.681:997,5240	206:711,5200	1.761:6195783	1.071:3005033	3.948:500 5000	1878
	1	1879	\$0:000	\$.000:0005000	5.000:0005000	1005000	7	\$\$2:1615000	3.289:926.5000	1	-2,050:538 § 191	5.602:9285701	4.546:3825689	1.921:8195120	203:5105800	1.697:4785521	1.900:010.5621	4.465:754 \$000	1879
	1	1850	50:000	8.000:0005000	8.000:000,5000	100,5000	1	253:1825600	4.107:180,5000		2.150:180,5649	6,811:1435219	4.635:5175105	1,002:0825450	193:5585900	2.697:1005818	2.850:0505618	4.563:740 5000	1880
		1581	80:600	8.000:0005000	8.000:0005000	100,5090	7	252:8395800	4.599:0095000		2.530:4085253	7.363:246 5033	4.752:112/581	1.081:1515930	192:9165000	1.591:6668-103	1.787:5825103	5.423:2225000	1881
		1882	\$0:000	8.000:0005000	8.000:000.5000	100,5000	7	252:267 8 100	3.920:2785030	1 4	1.813:2545106	5.991:799 \$506	6.239:225 3815	1.126:031 5500	192:3135000	1.561:831/333	1.757:177.5933	4.207:3225000	1583
		1583	80:000	8.000.0005000	8.000:0603000	100,500	6	251:0755600	4.176:0115000		1.875:8985582	6.002:9855189	4.315:806,5393	1.156:1135935	191:1515500	1.800:0085002	1.551:7596502	4.657:589.5000	1883
	140	1881	80:000	8.000.0005000	8.000:000 8000	100/1000	6	218:595.0100	4.255:208,000		2.180:159.5859	6.990:951 5289	4.211:5015627	1.053:0135510	188:0715000	1.550:5195915	1,730:5215515	4.778:8015000	1581
		1885	80:000	8.090:0005090	8.000:0005000	100,000	6	218:0210500	a.013:1613000	-	1.512:1635632	4.805:1825332	4.216:770,5755	1.420:2012510	189:0315000	1.005:9725872	1.195:0034872	5.497:8365000	1885
		1886	80:000	8.000:000,000	8.000:0005000	100,000		215:012 8000	0.1*0:001/000	1	3.200.3935911	8.937:5585971	3.408:557,5887	017:460 010	188:1175200	3.356:751,5165	3.513:901#365	3.811:5065000	1856
		1857	501009	a.0000000000000	8.000000000000000000000000000000000000	100,000	1	1701011000	4.503-190-5000		4.203:1865116	8.850:0135116	3.583:273.5550	1.206:9176000	117:0230200	2,888:410,5017	0.005:180 217	1.300:0365000	1887
		1888	135:000	13.500-000 5000	13 500-000 5000	100500	6 %	169:8915900	4 933-059 50-0		5.689:559 \$136	10.361:8115536	7.825:6026017	1.305:025,5725	116:265/100	1.739:430 5719	9.020-1005-11	10.058-500 000	1858
	a.	1899	135.000	13.500-0005000	13.500.000.5000	100.500	5		8.118.8565000		0.096:6035121	10.230:1186631	2.145:648.5115	2.311:050/146	100:0005400	1.001.005000000000000000000000000000000	1 001-114.5000	S 604-780 Arte	1500
		1590	135:000	13.500:0003000	13 500:000 5000	100500	6	-8-	5.618:201.5500		1.403.0976565	12.637:0535505	8.519:800 015	2.222:8898130	-9-	9.054-9166000	9951-3155690	34 760-637-5750	1891
		1001	103.000	10.00010100000	10.000.000.000	in the	1		10 010 1001000	1	4.5.18:751 5968	9.961:059 8468	13.029:501,0009	0.10178923100	-0-	2.201:3162020	a.a.51.313g 020	51.100:0319(35	10.01

(1) Capital em illulos de 1 e 5 acções. (2) Capital em titulos de 1, 5 e 10 acções.

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# ii. Example of monthly accounts for 1876

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		e.	QUADRO VII	continuação)	Resumo das	12 11 11	operações mensa	es de cada um d	los bancós				19			ta da
					Anno		4. 1978									i si kag
						The second	00 1070				<i>.</i>	-				
Estabelerimentos do credito Janeir			Ferercire	Março	Abril		Mafo	Junho	Julho	Agosto	Sotembro	Outabro	Novembra	Desambro	Media	
	( Daud words	289-1335300	289:1335800	289:131 5600	289:4975600		28917465200	289.7463200	289-235 5500	289:2165600	259:2165600	259:5165000	289:060.5100	289:119 \$400	250:3335133	
	Dinkeiro em caiza Notas do banco	812:972,5000	602:500 5000	888:5605000	120:5505000	1	418:370,5000	939:330,5000	1.193:110.5000	1.145:160,000	1.060:0205000	1.103:5595000	1.153:710,5000	012:210 5000	878:3395333	nation Contraction
	Especies metallic	1.550:258.5335	1.750:092,5720	1.383:9178260	1.075:6795032	1	2.031:1025137	1.455:4533505	1.310:503,5522	3.427:338,5058	2.918:2225352	3:026:5155440	3.318:0185907	3.451:447 5050	2.227:9395033	۰. 
	Desconto de letras	5.659:931 5055	5.560:5125072	5.420:225/915	5.507:5015017	ł	6.218:0305182	6.008:268,3051	5.932:574 5298	6.314:078.3157	5.760:091 \$010	5.749:0348662	5.577:810,9876	5.772:920,5461	5.792:6905741	<sup>л</sup> т в
Banco de Portugal	Emprestimo sobre penhores	2.079:170503	000.9105003	040.9075500	920:573.5800	10	2,452:201 5351	2.281:083 5386	2.214:5185626	2.140:3832016	2.181:158.006	000-000-5500	939-136 5008	299:1955600	2:100:2010000	
	Depositos Esperies metallie	2.815:033.550	3.240:0125903	3.037:987 5604	2.675:131,3255	1	8.136:632.5218	2.607:118.5253	2.571:109.5141	3.300:0525206	2.721:8735930	2.877:789\$135	2.505;805/337	2.844:8515300	2.593:4176241	
	Notas em circulação	3.155:208500	3.175:6305000	2.919:620 5000	3.117:6305000	Letin .	3.755:930 \$000	3.274:970 5000	2.951:190,5000	3.081:140.5000	3.230:250 5000	3:296:750 000	3.300:590 5000	8.690:0008000	3.268:0205667	
	5. S.				178-510-5170	S.							000.070.5004	844. con 17m4	054.103 5487	
	Dinheiro em caixa	231:782525	1 208:6655380	156:439 3462	867:6935328	141	224:0816531	231:1595781	280:207 5952	207:7075534	30017465103	931-991-591	091/7515891	911:0105919	925:611%520	
	Desconto de letras	160:016500	0 155:7208000	154:021 5000	151:291 5000		157:414.5337	160:351 5000	171:151.5000	165:801.5000	173:651 5000	175:9115000	108:5115000	169:411 2000	161:1125111	
Bance Commercial do Porto	Denosites	1.008:061580	4 1.013:770,5524	909:1165198	993:286 <i>§</i> 623	61	1.001:1585668	1.101:8035022	1.169:8445717	1.032:559 5032	1.034:1515119	1.016:5105174	973:0995201	957:191.5551	1.030:132 \$686	
	Notas em circulação	191:000500	0 128:890 5000	91:1005000	103:5105000		53:510 5000	70:140 5000	75:210,5000	7:8205000	4:700,5000	3:470,5000	\$:1705000	3:060 \$000	61:5345167	
				112.0006511	907-1018719	1	1.1.1				000-110-5000	100.001.5015	011-700-5151	319-001 5000	957-0955789	. j. j.
	Dinkeiro ein caixa	832:110.011	9 362:376 0190 5 747-756 \$3.19	59:0205412	756:527 5038		6810:5025350	505:5236521	S15:0032630	799-171 5578	282:140,000	1 107-199 5184	1.002:832.5115	830:830 5981	850:8085327	
N	Desconto de letras	458-105516	1 178:1145681	477:3125623	430:800,5719		459:5095500	485:351.5345	472:253 5890	408:1205925	454:0122350	426:156.5850	435:405,5005	441:2425033	452:251 5844 -	
Banco Mercantil Portuense	Danositos	261:028519	267:391,5035	214:027 \$206	241:6105200	11	276:6535302	311:245 8233	276:351 5872	176:7005513	130:253 \$ 069	125:1065167	138:385 6031	142:551 \$775	213:487 5308	
	Notas em circulação	123:509.500	181:156 5000	172:599,5000	142:301 5000	-in-	107:0335000	145:321,5000	120:351 \$000	12:593 5600	10:225 5000	7:4895000	21:257 \$900	59:952 6000	93:057,6417	
					100-301 5010	1	1							10.000100	470.8055704	8 °
	Dinheiro em caixa	726:584.83	578:670581	513:005 0016	49515012012	13	405:7338030	566:0035994	485:697 5231	194:4635960	891:955 5507	412:9165162	531:016 5373	110:105/0500	1.355-181 8507	
	Desconto de leiras	1.746:140.06	1.662:202200	102:5355610	192:625 5640	Y	1.402:0508463	1.376:449 0743	1.342:020,9962	193-3155640	195:085.5610	185-9155640	184:5754610	179:457 5715	195:0515450	
Banco Untão do Porto	Emprestimo cobre penhores	1.457:377.52	14 1.372:917.566	1.258:681 5188	1.310:209 5882	1	1.091:2825501	1.817:2975716	1.397:3355155	769:2775150	442:3595149	323:8915210	416:629 8971	862:5135801	957:651,5356	· · ·
	Notas can rirculação.	218:59050	250:930,500	187:990,000	179:930,5000	6	110:990 5000	111:000.5000	69:9905000	12:593.000	11:500,5000	6:8102000	4:000 5000	4:190,5000	92:917,3750	
	1				017.105.5000	1									020.170 0100	
	Dinheiro em esixa	287:78054	94 404:297 501	5 299:9325172	817:195/886	1	219:8085625	339;903 <i>§</i> 135	241:1585516	191:885.5006	916:209 5531	192:610,3866	270:580 3715	699:197.610	219:418/308	
	Desconto de letras	1.019:00003	55 9681769 549	2 929:8220110 1 358-3078612	1.508:586 4575	1	195:0515826	792:725 5686	802:481 063	158:350 5361	1 198-889.5913	1 195-948.502	1.902:0355813	1:183:5505704	1.263:7035363	
Banco Alliança (Posto)	Emprestituo sobre pentiores	862:620.50	76 413:132803	443:826 525	441:871 5978	4	347:002 5871	391:889 5033	388:5025525	148:0015490	80:5145826	\$8:561 \$830	113:0115702	141:4135511	280:381,5295	
	Notas em circulação	309:10050	00 332:470500	0 321:960,5000	256:270 000	11	215:670 5000	203:540 5000	324:2205000	84:7005000	127:0705000	93:100.5000	188:7105000	273:890 5000	231:0015167	
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	Dinheiro eta caixa	235:023 59	38 237:753 562	6 223:758,530	206:1573513	1	800:793 5518	335:166 \$246	334:174 6043	257:019 \$785	325:6145100	310:282 6124	336:2735715	420,186 § 353	301:0/23/86	
Neux Componita Utilidade	Desconto de letras	893:29203	186 923:595591	5 903:370 0104	3 307:8855678	1	913:5115040	937:925 5785	961:0055762	1.008:308,5000	965:7869216	933.828 8693	981-8305307	488:650 581	409:0955281	
Publica	Emprestino sobre penhores	1.140:29255	188 1.193:057585	3 1.135:120 536	4 1.001:519 5085	Th.	1.148-168.5993	1.179-0085737	1.100.6315131	1.073:910 \$610	991:2925687	967:617518	1.012.6925182	1:271:005 6201	1.117:104 5939	1.1
	Notas on circulação	156:5006	156:600 00	136:500 500	0 153:500 5000	1	53:500 5000	60:5005000	98:500 \$ 000	12:5305000	16:5005000	16:375 5000	6:6205000	35:800 5000	75:418 5750	
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	Lisboa	280:0175	844 862:804.58	117:521535	1 260:367.5537		810:857508	120:0885565	146:082,0075	428:165 5881	142:0175315	161:612568	0 192:841 § 500	202:289 \$28	222:29?5846	
	Dinheiro en caixa Porto	116:5615	858 92:880 <b>5</b> 6	50:933§78	8 91:987 5510	1.	101:001.045	81:4005300	127:5125549	153:427 \$148	11:0115075	59:509500	101:7315330	161:996543	103:8595317	34
New London and Brazilia,	Descupia de letras	735:028@	818:90754	665:997698	1.005:9134705	1	880:189501	629:8320381	632:236 6055	706:0165250	635:0505100	000:357579	5 510:576570	489:092583	863:4565103	
B2nk	.   Porto	409-179 S	529 451-3/850	78 437:624.591	449:552,5000	皆	459:601 515	A11-100 5cm	550:3175723	395-110530	415:524.5165	436:128528	1 513:6225710	562:801540	418:3065108	19
	Depositos Porto	210:0783	101 215:91350	186:610,527	116:5525207	10	178:277.617	208:509.552	320:929586	157:709510	177:371 508	171:453577	4 167:302.557	1 222:451 696	191:1465058	
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	/ Dipheiro em caixa	582:511 <i>§</i>	358 623:68554	58 249:697.523	221:500\$787	10	201:268678	3 S61:409.5191	243:036 5823	168:631 537	226:927 \$72	150:146511	1 149:059586	\$ 210:014560	287:35555876	$= - \int_{-\infty}^{\infty} e_{ij} di$
Banco Nacional Vitramaste	Desconto de letras	1.618:190 <i>5</i>	265 1.589:439 53	33 1.360:983 5K	57 1.320:8105581	19	1.248:558 591	3 1:202:885 5100	3 1.162:6165163	967:693558	025:917569	850:651518	3 900:193504	6 874:963535	7 1.173:513 5005	
(Listoa)	Emprestimo sobre penhores	870:6175	261 879:68358	96 600:547 51	17 809:769 5280	11	797:486509	6 711:8855755	700:8695655	810:823,509	867:200 311	817:151.09	8 819:197575	515:631 553	S23:314 5008	e dan
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				. ti	이 집을 수 있다.	1		1996	-					6. NG - 1	i de la composición de	
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