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Study

“Determinants of Corporate Risk using Option-Adjusted  
Spreads: The case of Portugal”

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## ABSTRACT

This study analyses the determinants of corporate bond spreads in Portugal. Using an Option-Adjusted Spread (OAS) approach we overcome the difficulties of comparing bonds with different cash-flow characteristics. OAS considers credit risk and contingent cash-flow risks, which allows the determination of a contingent premium analysis based on the bond's characteristics. Our findings suggest that corporate bond risk spreads are determined by firm specific factors, bond characteristics, sovereign risk, macroeconomic conditions and external variables. We also find evidence of high dependency of the banking industry implicit funding costs on the sovereign risk proxy variable and the ratio of Public Debt to GDP.

## KEYWORDS

Option-adjusted spreads, corporate bond risk, sovereign risk, Portugal

## RESUMO

Este estudo analisa os determinantes dos *spreads* de taxas de juro das obrigações de empresas no mercado obrigacionista português. A utilização da abordagem *Option-Adjusted Spread* ultrapassa as dificuldades na definição das emissões de dívida pública de referência para o cálculo dos *spreads* de taxa de juro e permite a comparação de obrigações com diferentes características. Os resultados do estudo sugerem que os indicadores das empresas que reflectem a gestão realizada, as características das obrigações, o risco soberano, as condições macroeconómicas do país e os efeitos externos, concorrem para a determinação dos níveis dos prémios de risco requeridos pelos investidores em obrigações de empresas. Os resultados obtidos apontam, também, para uma elevada dependência dos custos de financiamento do sector bancário local relativamente ao risco soberano e ao nível de endividamento público na economia.

## Palavras-chave

“Option-adjusted spreads”, obrigações de empresas, risco soberano, Portugal

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## 1. INTRODUCTION

In this study we analyse the determinants of corporate bonds spreads in the Portuguese bond market. Although we are aware of the low liquidity of this market, and the importance of the banking sector on Portuguese corporate funding arrangements, there are still a relevant number of firms using the debt market as a main source of capital for financing their activities. We are particularly interested on assessing the importance of firm-specific variables, bond characteristics, sovereign risk, macroeconomic conditions and external factors as well as industry effects on yield spreads demanded by bond investors.

Since the 2007 debt crisis, the market confidence, related to countries and corporate capacity to fulfill their debt obligations, suffered enormous pressure, and resulted in extreme situations, on state aid to corporations and banks, and also on country bailouts. The most recent country bailout was performed by Portugal that agreed, on April 2011, with the International Monetary Fund, European Commission, and European Central Bank, a financial assistance package to avoid bankruptcy of the public administration and mitigate systemic risks on the private sector. We have witnessed a major escalade on yield spreads of government and corporate bonds in European peripheral countries due to capital scarcity and increase on risk awareness.

As a consequence of the downgrade of credit rates of the Portuguese Republic by major rating companies, the Portuguese financial institutions, and large Portuguese corporations' ratings were downgraded. This indirect effect, called the "sovereign ceiling"<sup>1</sup>, was of particular importance to domestic corporations, unlike Portuguese branches of multinational companies.

Our goal in this study is to investigate the determinants of the credit spreads of Portuguese corporate bonds.

Although spill-over effects on Portuguese government debt are being extensively studied, we decided to focus on the Portuguese private firms that finance their activities on corporate bond market, and test some of the more widely used variables to explain yield spreads.

The sovereign risk is also included in our study, because the Portuguese Government faced an increasing public debt in the last decade, thus violating the Stability and Growth Pact of the European and Monetary Union. As referred by Gerlach, Schulz and Wolff (2011), sovereign risk has become increasingly interconnected with banking risk, due to the possibility of financial sector rescue package. This can ultimately result in relevant fiscal burdens which increase the risk of sovereign default.

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<sup>1</sup> The sovereign ceiling doctrine states that rating agencies tend to rate private firms with an equal or inferior rating to the rate that is given to the country.

We follow closely the work by Cavallo and Valenzuela (2010), and Peter and Grandes (2005). Our Option-Adjusted Spread approach is based on the paper by first authors, with some adaptations to study a country case - Portugal. From Peter and Grandes (2005), we adapted their empirical procedures to study a country case with the data available from the corporate OAS analysis by Bloomberg. We use an unbalanced panel dataset<sup>2</sup> of Portuguese corporate bond OAS, thus avoiding the pairing of corporate bond issues and government bonds with the same characteristics.

The sample of the Portuguese corporate bond market used in this study suffers from: (i) low trading, resulting in absence of quotations/prices for some dates; (ii) the small number of bond issuers as a result of a corporate preference by banking loan arrangements and short term debt instruments.

We focus on the determinants of the corporate yield spreads for 97 bonds issued by 11 corporations in 6 industry sectors, for a time period of 26 consecutive quarters from 31<sup>st</sup> December 2004 until 31<sup>st</sup> March 2011, with available data in Bloomberg.

Our main results confirm that firm-specific variables, bond characteristics, macroeconomic conditions, sovereign risk, and global factors are all determinants of credit risk in Portuguese corporate bonds. We also found evidence of high dependency of the banking industry funding costs on sovereign risks variables, and indicator Public Debt to GDP macroeconomic ratio. There were some findings related to bond characteristics and firm-specific variables that presented unexpected results which may be a consequence of shorter durations of bond issues and some bias on our data sample that is dominated by local companies with non-tradable goods and services.

We contribute to the existing literature in at least one front: we are, to the best of our knowledge, among the first to employ OAS to explore the determinants of corporate bond spreads in the Portuguese bond market.

The structure of the document is as follows. In section 2 there is a literature review and Section 3 sets out the Option-Adjusted Spreads framework. In Section 4 the empirical strategy, the choice of variables and the regression results are presented. In Section 5 we present our major conclusions, and discuss areas of improvement, and adjustments for future work.

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<sup>2</sup> Yaffe (2003), writes that panel data analysis endows regression analysis with both a spatial and temporal dimension. Panel data sets generally include sequential information on which there is a time series. If there are no missing values, the data set is called a balanced panel, but if there are missing values, the data set is referred to as an unbalanced panel.

## 2. LITERATURE REVIEW

There is an extensive work on the determinants of corporate bond spreads, and on the factors affecting the risk premium required by corporate bondholders. There are some misleading concepts regarding credit risk, default risk, liquidity risk and risk premium, depending on the perspectives developed by different authors or the synonyms that are used on several papers. However, in this study we will consider the corporate yield spread as a proxy for a aggregate risk premium over risk free interest rate.

Our study is related to the literature on the determinants of corporate risk and follows closely the work of Cavallo and Valenzuela (2010), who developed the empirical tests of credit risk using as a proxy the option-adjusted spread (OAS). The major difference is that they performed a cross-country analysis for emerging countries, while we centre our analysis on a single country – Portugal. Furthermore, we also investigate the effects from industry-specific factors.

The work of Peter and Grandes (2005), is also a main reference for this study for using single country data set similar to ours. The paper focuses on the impact of sovereign risk and company-specific factors on corporate default premium (measured by the corporate yield spread). They worked with bonds of publicly traded firms in South Africa issued in local currency, but they did not use OAS.

The use of OAS is an incumbent approach on literature related with the analysis of the determinants of corporate bond spreads which was developed in the late 1960's and mid 1970's.

There was a seminal paper related with the OAS approach by Huang and Kong (2003) where they used both weekly and monthly OAS from bond indices to examine the determinants of corporate bond credit risk in the United States. They found that credit spread changes for high-yield bonds are more closely related to equity market factors, and they also provide evidence in favour of considering macroeconomic factors into credit risk models.

Cavallo and Valenzuela (2010) used OAS analysis and found that firm-specific variables (profitability, capitalization, leverage and size), country and industry fixed effects, sovereign risk, bond characteristics and global factors, all account to explain the corporate bonds spreads in emerging market economies.

Merton (1974) was amongst the first to study the pricing of corporate debt as a yield spread and defined a “theory of the risk structure of interest rates”. The use of the term “risk” here is restricted to the gain or losses on the bond value solely defined by changes on the probability of default. The key issues were addressed based on an extension of Black and Scholes's



(1973) theory of options pricing. In fact, the basic equation for the pricing of financial instruments is used to find a theoretical price for the corporate debt. The intrinsic firm value is included in the analysis as Merton proves the Modigliani-Miller theorem<sup>3</sup> (in the presence of corporate bankruptcy), and deduces the required return on corporate debt as a function of the debt-to-equity ratio. According to Merton, the corporate default spread is an increasing function of firm-value volatility and leverage, which can be an increasing or decreasing function of remaining time to maturity, depending on the level of leverage. The results by the Merton model, as referred by Peter and Grandes (2005), produces a flexible shaped term structure of credit spreads. This term structure of credit risk spread is a downward slope for high-leveraged firms, hump-shaped for medium-leveraged firms, and an upward slope for low-leveraged firms. The impact of these variables on the yield spread is dynamic, depending on the debt-to-equity ratio.

Altman et al. (1968, 1989, 1997) analyse default risk based on credit ratings. They investigated the marginal migration rates, and found that impacts on asset price changes are a function of credit quality changes. These results lead to subsequent work on the adequate management of credit risk using credit-risk-derivatives. They defined a 7-variable model (the popular Zeta model<sup>4</sup>) as the most reliable in various validation procedures regarding the prediction of corporate default risk: return on assets, stability of earnings, debt service, cumulative profitability, liquidity, capitalization, and size. They also found that these variables were highly correlated with corporate bond ratings.

Collin-Dufresne et al. (2001) found that the dominant changes on corporate bond market spreads are driven by a systematic factor, related to local supply/demand shocks that are independent from liquidity measures and credit-risk changes. These results had already been tested by Boudoukh et al. (1997), as well as Duffie and Singleton (1999). These conclusions questioned the theoretical models of default risk that were being used. Although the structural models of default pointed to firm-specific factors as the driver of credit spreads, there is evidence that the credit spread of individual bonds is explained by an aggregate factor common to all corporate bonds. Elton et al. (2001) also present an explanation for the yield spread on corporate bonds, based on a risk premium to compensate investor for systematic risk, closely related to the factors that affect risk premiums for stocks. They show that the yield spread required by corporate bond investors is larger due to the fact that the corporate bond risk is systematic and not diversifiable. Huang and Huang (2002) have also shown that

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<sup>3</sup> The Modigliani-Miller theorem states that the value of the firm is invariant to its capital structure obtains, which means that the value of the firm can be treated as exogenous to the analysis.

<sup>4</sup> One of Altman models (1968) using the statistical technique multiple discriminant analysis computes a score that indicates the level of credit problems a firm presents: a score inferior to 1.81 indicates a firm with serious credit problems while a score superior to 3.0 indicates a healthy firm.

only a small fraction of the corporate-treasury yield spread is explained by credit risk. The robustness of this finding is tested in different models.

On another front, the work of Campbell and Taksler (2003), based on Merton (1974), develops the following idea:

“When volatility increases, the value of the put options increases, benefiting equity holders at the expense of bondholders. The volatility that is relevant for option value, and thus for corporate debt, is total firm volatility, including both idiosyncratic volatility and systematic or market-wide volatility.”

This rationale is the basis for the paper where they measure the causes of variation in corporate bond yield spreads relative to Treasury bonds. In fact, they show that even in the presence of credit rating, the equity volatility is as explanatory as credit rating.

Longstaff et al. (2005) used information from credit derivatives – credit default swaps - as a way to measure the size of the default and non-default component in corporate yield spreads. They found that the majority of corporate spreads is represented by the default component, and thus suggest that the market price of credit risk may be larger than the amount implied by some structural estimates. Additionally, they also found that changes in the non-default component are related to measures of Treasury richness – such as the on-the-run/off the-run spread<sup>5</sup> – as well as to measures of the overall liquidity of fixed income markets, such as the flows into money market mutual funds. This enhanced an area of research related to the effects of liquidity on security prices. One example of this was given by Chen et al. (2007), who found that liquidity is priced on corporate yield spreads, strengthening the idea that neither the level, nor the dynamics of yield spreads are fully explained by default risk determinants. Their results mean that liquidity is a key determinant in yield spreads, and explains as much as half of the cross-sectional variation in yield spread levels, and as much as twice the cross-sectional variation in yield spread changes that is explained by credit rating.

The different approaches from the literature suggest some lack of consensus regarding the magnitude of the major determinants of corporate-treasury yield spreads. The reasons appear to be related with the specific models developed to estimate credit default risk, as well as with the different sources of data regarding the market price of risks.

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<sup>5</sup> The “off-the-run treasuries” are all Treasury bonds and notes issued before the most recently issued bond or note of a particular maturity. These are the opposite of “on-the-run treasuries”. As “off-the-run securities” are less frequently traded, they typically are less expensive and carry a slightly greater yield.

### 3. OPTION-ADJUSTED SPREADS

The most popular measure of yield in the bond market is the yield to maturity<sup>6</sup> (YTM) (Fabozzi, 2007). The computation of the YTM is done by a numerically trial and error process where a yield rate is set in order to equalize the present value of expected cash to the dirty price of the bond. The YTM is a special case of an internal rate of return calculation where the cash-flows are certain if the security is held to the maturity date.

The investment in fixed income securities is exposed to different types of risk: interest rate risk, call and prepayment risk, yield curve risk, reinvestment risk, credit risk, liquidity risk, exchange-rate risk, volatility risk, inflation risk, event risk, and sovereign risk. The structure of a bond – coupon rate, time to maturity, embedded options, and currency – changes some of these risks.

The traditional evaluation analysis of fixed income securities is based on YTM comparisons for bonds with similar characteristics (Miller, 2007). The assumptions on which these comparisons are made are relatively reliable for bullet bonds<sup>7</sup>. However the use of this method to compare bonds with embedded options raises a fatal flaw in the conclusions. The uncertainty of the cash-flows is not taken into account on valuing the bond, and thus, the incremental risk is not accurate. Even if the benchmark for the bond issue presents the same characteristics (including same features on options), that does not guarantee an effective analysis, unless options are exercised at the same time.

To overcome these difficulties, some analyses compare bonds with the yield to call/put or yield to worst. This method lacks accuracy when dealing with yield spread analysis (or credit spreads) because a relevant bulk of the potential cash-flows can be eliminated. When a yield spread refers to a bond that has an option, a component of the spread accounts for the risk associated with the embedded option<sup>8</sup>. The yield spreads are referred to as nominal spreads — in the sense that the value of embedded options has not been removed in computing an adjusted yield spread. The yield spread that adjusts for the embedded option is referred to as the option-adjusted spread (OAS). As in Fabozzi et al. (2005):

“The OAS for a security is the fixed spread (usually measured in basis points) over the benchmark rates that equate the output from the valuation process with the actual market price of the security. For an optionless security, the calculation of OAS is a relatively simple, iterative process. The process is much more analytically challenging with the added complexity of optionality. And just as the value of the

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<sup>6</sup> The yield to maturity (YTM) is the interest rate that equals the present value of a bond's cash-flows to its market price plus the accrued interest.

<sup>7</sup> A bullet bond is a bond that is not possible to be redeemed prior to maturity and pays the entire principal at maturity. It is also known as vanilla bond, straight or fixed bond because it has no special features.

<sup>8</sup> The yield spreads that are reported or published do not adjust for embedded options, unless the OAS is indicated.

option is volatility-dependent, the OAS for a fixed income security with embedded options or an option-like interest rate product is volatility dependent.”

The bond market participants developed the habit of valuing the securities using yield spreads, rather than price spreads (Martellini et al., 2003). That is the reason why comparison of theoretical price of different bonds, with embedded options, with the market price is based on a yield spread. The value of this yield spread, added to all spot interest rates derived from valuation models (default-free term structure of interest rates), equalizes the theoretical price of the bond with its available market price. This OAS is, thus, a relative measure that deals with the pricing of the contingent cash-flows that are dependent on the embedded price options of the bond. Therefore the OAS depends on the volatility parameter defined in the valuation model of the bonds: the higher the volatility of the short-term interest rate, the lower the theoretical price of a callable bond, and, hence, the lower the OAS of the callable bond (and inversely for a puttable bond).

Because the bond valuation models are calibrated to the term structure of government interest rates, the OAS of a bond with, or without, an embedded option can be interpreted as a credit premium on the bond over a “risk free” interest rate.

The OAS analysis benchmarks the bond’s expected cash-flows against reference rates in the market, and values the embedded options against market volatility; thus enhancing a consistent assessment of the risk premium demanded by investors, and a meaningful comparison between bonds. As a result, this approach overcomes the major flaws in traditional yield spread.

The Bloomberg Professional Analysis, available to Bloomberg users<sup>9</sup>, develops the OAS analysis based on calculation engines for the early redemption features of the selected security, so it is possible to make relative value judgments based purely on credit risk. It is also possible to compare bonds with different redemption features on a similar basis, and identify expensive/cheap securities.

The OAS is computed by Bloomberg for most of the bonds in the market (that have prices/quotations). The OAS Bloomberg valuation model is based on a benchmark spot curve derived from the well-known bootstrapping method (using the conventional normal model for the term structure of interest rates, also referred to as the Hull-White/Jamshidian, Extended Vasicek, or Gaussian model).

For conventional bonds the OAS function utilizes the “benchmark spot curve” to value a bond using the appropriate discount factor for each cash-flow. Therefore, instead of using a yield to

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<sup>9</sup> The Option-Adjusted Spread Analysis is defined by command OAS1 and historical data is accessed by function HOAS. Information complemented with Miller (2007).

maturity comparison with a benchmark issue, the OAS is a constant spread that adds to the benchmark spot interest rate in order to equalize the market price of the risk-free bond – calculated by the pricing model – to the observed market price of the corporate bond.

The OAS spread for bonds with embedded options is calculated based on a one-factor, arbitrage-free binomial tree of normally distributed short-rates<sup>10</sup>, in order to establish a distribution of different interest rate scenarios, which are driven by the volatility input for the interest rate. The exercise events are introduced according to options features, and interest rates are calculated over the time horizon until maturity. The modelled cash-flows are valued using the discount rates found in the tree, and the OAS is then calculated in order to equalize the theoretical price plus the spread to the current market price of the bond. The OAS is therefore a spread adjusted by the option premium embedded in the bond.

The computation process of OAS allows a pooling comparison of bonds (with or without options). However, this is only possible if the spreads are derived using the same interest rate modelling process and taking into account the same volatility or the same term structure for the volatility.

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<sup>10</sup> The normal, mean-reverting, model, also referred to as the Hull-White/Jamshidian, Extended Vasicek, or Gaussian, hypothesize that the distribution of the short rate at time  $t$  is given by a normal distribution. This model explicitly incorporates mean reversion in order to match the initial yield curve. Mean reversion assumes that if interest rates rise to some very high level (relative to historical ranges), then pressure on interest rates to revert to a (historically) "reasonable" level would exist (and, similarly, for very low rates reverting to higher levels).

#### 4. RESEARCH FRAMEWORK AND RESULTS

The issue we want to address in this study is the assessment of the determinants of corporate risk using OAS for Portuguese corporate bonds issued in Euro.

Our study follows a model approach based on Cavallo and Valenzuela (2010). We test the several determinants grouped into six sets: 1) firm-specific variables related with corporate risk; 2) firm market value risk defined by the equity volatility; 3) bond characteristics; 4) sovereign risk using proxy indicators; 5) macroeconomic conditions at country level affecting the risk of all firms; and 6) external factor reflecting global factors. The results point to a set of independent variables that explains over 80% the spreads.

As referred by Martellini, Priaulet and Priaulet (2003) and Huang and Kong (2003), the OAS is a spread in relation to a term structure of default-free interest rates that remunerates investors for a portfolio of risks: the expected default loss, the contingency of future cash-flows, liquidity and also tax charges. The OAS for liquid bonds is available daily, but we defined quarterly average OAS per bond, as the majority of corporate financial information and macroeconomic indicators are available only on a quarterly basis. As in Cavallo and Valenzuela (2010), we applied the natural logarithm to the OAS, and that is the dependent variable on our regression<sup>11</sup>. In the regression analysis we included industry-dummies to analyse industry effect, and assess the heterogeneity of the industry risks on Portuguese corporate bond market.

During the preliminary specification process of the multivariate linear regression we abandoned several independent variables, due to high level of correlation, or because they were not statistically significant (see excluded variables on Table A.1 in the appendix).

##### 4.1. DATA DESCRIPTION

To build the database we used information from 97 bonds, available at Bloomberg, issued by 11 listed Portuguese corporations, over 6 sectors between 31<sup>st</sup> December 2004 and 31<sup>st</sup> March 2011. The companies are in the following sectors: Building Materials & Fixtures (1 company), Transportation Services (1 company), Recreational Services (2 companies), Telecommunications (1 company), Conventional Electricity (2 companies) and Banking (4 local banks).

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<sup>11</sup> The transformation of the dependent variables and some of the independent variables by applying the natural logarithm improves normality of the data. This limits a violation of the linear regression assumption that variables have normal distribution.

The sample selection was based upon data availability. The country and firm-specific variables are typically reported on a quarterly basis, while bond spreads and indices are reported daily. To avoid time noise effects, we transformed the daily data into quarterly frequency by computing the corresponding period average.

Our sources of information were: 1 - Bloomberg database on publicly traded firms; 2 - Financial statements and announcements from company sites and the Portuguese securities supervisory authority (CMVM); 3 - Bank of Portugal and National Statistics Institute (INE) for macroeconomic variables; 4 - European Central Bank for government bond yields, and 5 - STOXX for external factors.

The type of data and availability lead to an unbalanced panel data of 97 euro denominated corporate bonds, from 11 firms over a time frame of 26 consecutive quarters.

The historical data of the dependent variable – OAS of Portuguese corporate bonds issued in euro – was limited due to the fact that the less liquid bond issues have infrequent quotes. This is the result of a limited interest of market investors, and consequently historical OAS was not available for illiquid bonds.

The independent variables are grouped into six sets. We also include industry-dummies to analyse industry effects. Table 1 provides a list of the variables, definitions and sources.

**Table 1. Description of Variables**

| Group Set                   | Variable                   | Description                                      | Unit of Measurement               | Data Source   |
|-----------------------------|----------------------------|--|-----------------------------------|---|
| <i>Dependent variable</i>   |                            |  |                                   |   |
| Corporate OAS               | OAS                        | Option Adjusted Spread for corporate bond issues | Percent (natural logarithm)       | Bloomberg   |
| <i>Independent variable</i> |                            |  |                                   |   |
| 1. Firm specific            | Size                       | Amount of assets                                 | Millions euro (natural logarithm) | Financial Statements , firm sites and Comissão do Mercado de Valores Mobiliários (CMVM) |
|                             | Equity/Debt                | Ratio of equity to company debt                  | Percent                           |   |
|                             | Debt <sup>12</sup> /Assets | Ratio of debt to company assets                  | Percent                           |   |
|                             | Ebitda/Assets              | Ratio of EBITDA to company assets                | Percent                           |   |
|                             | Debt/Ebitda                | Ratio of Debt to company EBITDA                  | Percent                           |   |

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<sup>12</sup> The debt amount referred to firms of banking industry reflects the amount of subordinated debt.

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| Group Set                   | Variable            | Description   | Unit of Measurement         | Data Source                         |
|-----------------------------|---------------------|---|-----------------------------|-------------------------------------|
| 2. Firm market value        | Volatility          | Volatility of daily returns on stock price – 12 months                  | Percent                     | Bloomberg (Prices)                  |
| 3. Bond characteristics     | Time to Maturity    | Bond maturity (natural logarithm)                                       | Years                       | Bloomberg                           |
|                             | TtM Debt/Assets     | Interaction term between Bond Time to Maturity and Debt to Assets ratio | Years                       | Bloomberg and firm specific sources |
| 4. Sovereign risk           | Portuguese 10YYield | 10 years Government bond yield  | Percent (natural logarithm) | European Central Bank               |
| 5. Macroeconomic conditions | Debt/GDP            | Portuguese public debt ratio to GDP                                     | Percent                     | Instituto Nacional de Estatística   |
|                             | Confidence Index    | Portuguese global economic confidence index (growth)                    | Percent                     | Bank of Portugal                    |
| 6. External factors         | VSTOXX 12M          | 12 month volatility EuroSTOXX 50 index                                  | Percent                     | Stoxx                               |

The descriptive statistics for the variables tested in the regression are included in Table 2. There are some indicators that reflect the heterogeneity of the sectors, and also some outliers that are related to the data from the companies of Recreational Services sector.

**Table 2. Descriptive Statistics**

| Variables           | N   | Mean   | STD    | Skewn<br>ess | Kurtosi: | Min      | Max    | Percentiles |        |        |
|---------------------|-----|--------|--------|--------------|----------|----------|--------|-------------|--------|--------|
|                     |     |        |        |              |          |          |        | 25          | 50     | 75     |
| OAS                 | 741 | 0.52   | 0.97   | -0.27        | -0.62    | -2.23    | 3.08   | -0.12       | 0.59   | 1.29   |
| SIZE                | 741 | 10.14  | 1.46   | -1.89        | 4.17     | 4.47     | 11.51  | 9.56        | 10.53  | 11.30  |
| EquityDebt          | 741 | 151.04 | 127.64 | 1.01         | 1.34     | -31.02   | 702.45 | 49.03       | 86.99  | 281.43 |
| DebtAssets          | 741 | 23.89  | 21.80  | 0.68         | 0.11     | 1.32     | 104.82 | 2.81        | 26.55  | 38.25  |
| EBITDAAssets        | 741 | 6.19   | 6.11   | 0.27         | -0.26    | -18.49   | 26.47  | 0.77        | 7.82   | 9.55   |
| DebtEBITDA          | 741 | 195.17 | 7,036  | -25.44       | 681.85   | -187,126 | 31,601 | 279.00      | 396.47 | 459.61 |
| Volatility          | 741 | 30.58  | 11.41  | 0.33         | 0.48     | 10.96    | 82.13  | 19.25       | 33.61  | 37.47  |
| TimeToMaturity      | 741 | 1.05   | 1.09   | -1.03        | 1.75     | -3.95    | 2.99   | 0.47        | 1.17   | 1.80   |
| TtMDebtAssets       | 741 | 0.30   | 0.42   | -0.30        | 4.45     | -2.81    | 1.39   | 0.01        | 0.07   | 0.62   |
| Portuguese10Y Yield | 741 | 1,56   | 0.22   | 0.63         | -0.53    | 1.20     | 1.99   | 1.39        | 1.49   | 1.72   |
| DebtGDP             | 741 | 78.06  | 11.80  | -0.11        | -1.40    | 57.55    | 93.80  | 67.32       | 79.91  | 90.67  |
| ConfidenceIndex     | 741 | -0.17  | 5.70   | 0.84         | 2.66     | -13.77   | 17.21  | -3.12       | -0.48  | 3.09   |
| VSTOXX12M           | 741 | 26.79  | 6.78   | 0.11         | -0.53    | 14.82    | 42.63  | 19.71       | 25.82  | 31.19  |



On Tables A.2 and A.3 in the appendix we present the correlation matrixes for Person coefficient and also using Spearman due to the existence of the referred outliers. There are some high correlation coefficients that must be taken into account on the conclusions. The relations between variables are also presented on Figure A.1 in the appendix where we use scatter plot chart to analyse potential correlations. In relation to time series, we present several time charts on Figures A.2 and A.3 in the appendix, which suggest a similar behaviour between the OAS and the yields on the 10Y Portuguese Government Bonds. For illustrative purposes we also include in the time charts the yield spread between the Portuguese 10 year bond and the German bund.

For the economic intuition of the effects in our regression, and to indicate the expected signs on the coefficients of the regression, we refer to the work of Huang and Kong (2003) and Collin-Dufresne et al. (2001). Table 3 provides a predicted sign on the coefficients of the regression for potential explanatory variables.

**Table 3. Explanatory Variables and Expected Signs on the Coefficients of the Regression**

| Group Set                   | Variable            | Description   | Predicted Sign |
|-----------------------------|---------------------|---|----------------|
| 1. Firm specific            | Size                | Amount of assets (natural logarithm)                                    | -              |
|                             | Equity/Debt         | Ratio of equity to company debt - %                                     | -              |
|                             | Debt /Assets        | Ratio of debt to company assets - %                                     | +              |
|                             | Ebitda/Assets       | Ratio of EBITDA to company assets - %                                   | -              |
|                             | Debt/Ebitda         | Ratio of Debt to company EBITDA - %                                     | +              |
| 2. Firm market value        | Volatility          | Volatility of daily returns on stock price – 12 months %                | +              |
| 3. Bond characteristics     | Time to Maturity    | Bond maturity (natural logarithm)                                       | +              |
|                             | TtM Debt/Assets     | Interaction term between Bond Time to Maturity and Debt to Assets ratio | -              |
| 4. Sovereign risk           | Portuguese 10YYield | 10 years Government bond yield (natural logarithm)                      | +              |
| 5. Macroeconomic conditions | Debt/GDP            | Portuguese public debt ratio to GDP - %                                 | +              |
|                             | Confidence Index    | Portuguese global economic confidence index (% growth)                  | -              |
| 6. External factors         | VSTOXX 12M          | 12 month volatility STOXX index - %                                     | +              |

1) Firm-specific variables

The firm level determinants of corporate risk (mainly financial risk factors) are based on Altman (2000), but we focus on the following indicators: the size of the company – total assets; the capital structure of the firm (ratio equity/debt); the leverage of the company (Debt/Assets); the capacity to generate operational results (EBITDA/Assets), and the percentage proportion of Debt to operational results. The more leveraged is a firm, and the less capacity company have to generate earnings—compared to total debt – the more remuneration investors ask, and hence the higher is the expected credit spread risk. The other variables are expected to have a negative impact on spreads, because investors tend to associate scale and company core results with lower risk of default. The ratios with EBIDTA were adjusted on first 3 quarters of the year by a *prorata temporis* effect<sup>13</sup>. In Figure A.4 to A.9 we present the variables per each sector.

2) Firm market value

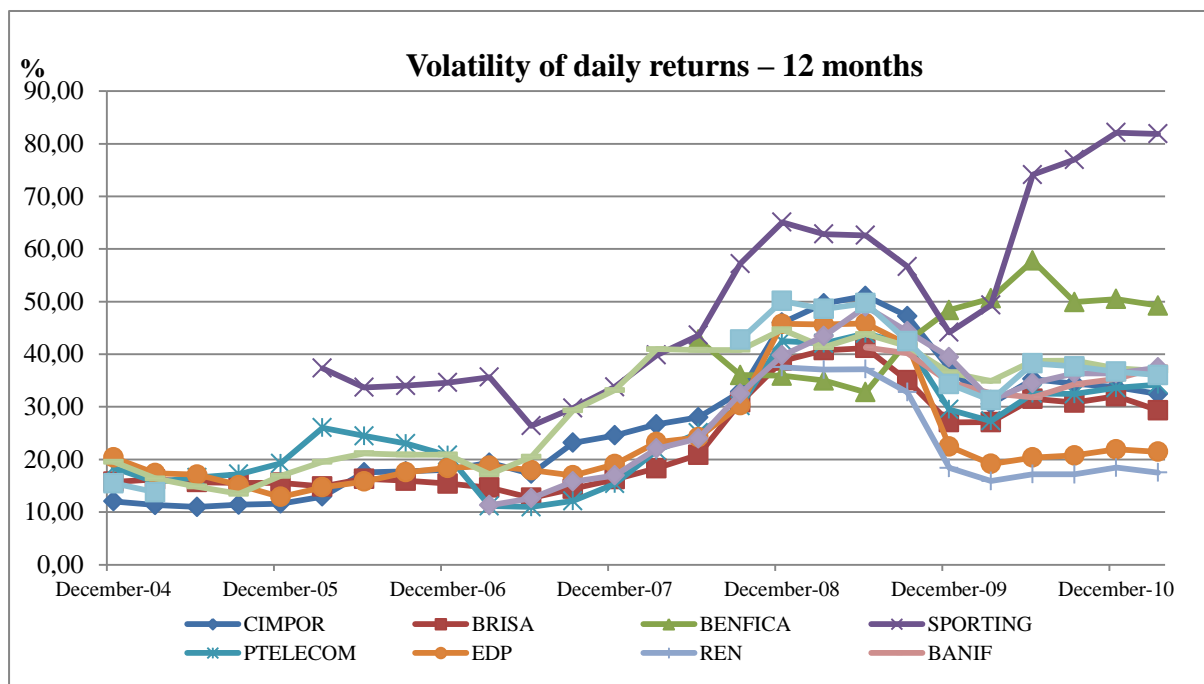
Following Campbell and Taksler (2003) and Merton (1974) findings, Cavallo and Valenzuela (2010) we included the volatility of equity as up-to-date information regarding a forward looking on firm future value. In fact, the higher the volatility, the higher the probability that the market value of the company may be similar to the debt market value, thus resulting in a higher probability of default. Therefore, to compensate for the risk of default, bondholders will demand higher remuneration, i.e. higher spreads. We use the yearly volatility at quarter-end per each stock of the 11 firms. We did not consider the rating changes as in Cavallo and Valenzuela (2010), because, as referred by Ederington et al. (1984), they found that investors base their evaluations of an issue's credit worthiness on more than the agencies' ratings, as they take decisions using a set of readily available financial accounting statistics<sup>14</sup>.

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<sup>13</sup> The quarterly data with information on the 3 month period was extrapolated to yearly data using a *prorata temporis* adjustment by  $\frac{3}{4}$ ,  $\frac{1}{2}$  and  $\frac{1}{4}$ .

<sup>14</sup> However in some investment strategies there may be some restrictions/limitations on the asset exposure defined by rating criteria.

**Figure 1 – Volatility of Stocks**

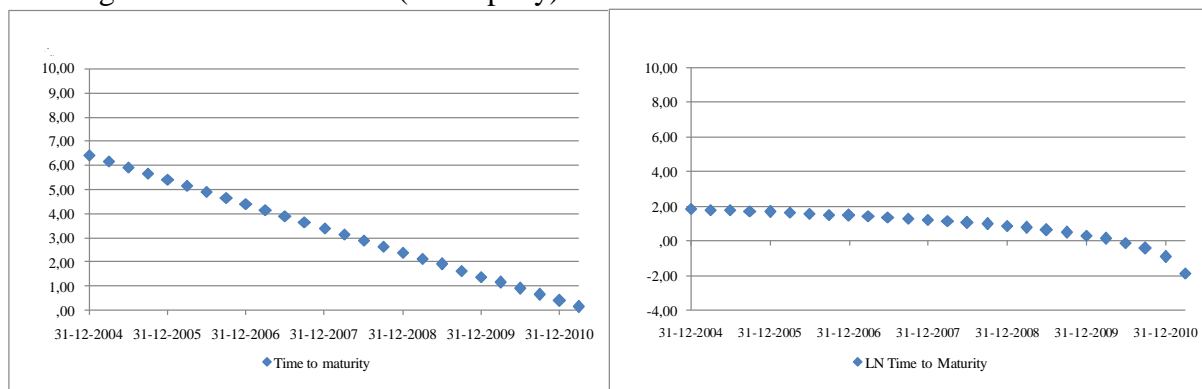


### 3) Bond characteristics

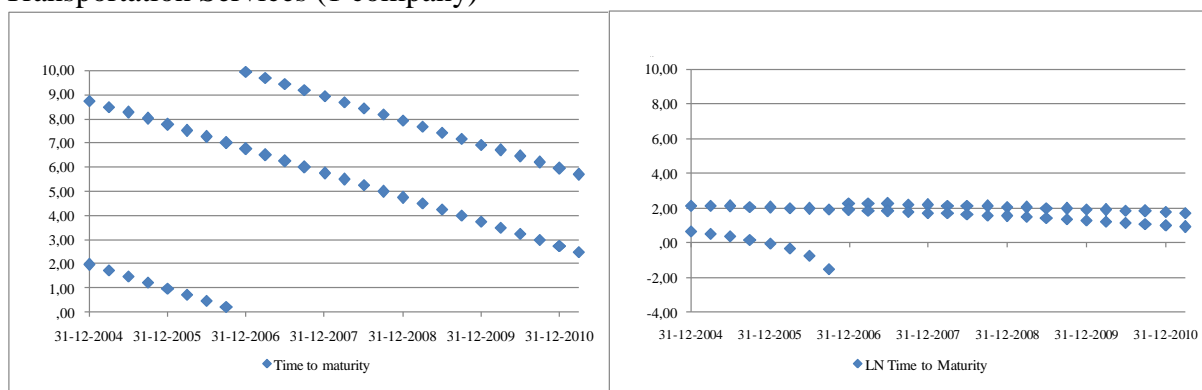
In this set is included the time to maturity of the bond (years to maturity in natural logarithm), in order to incorporate the uncertainty of default. The longer the maturity, the higher is the associated risk by bondholders. The findings by the Merton model, as referred by Peter and Grandes (2005), produces the classical hump-shaped “term structure of credit spreads”. As in Cavallo and Valenzuela (2010), we also include the control factor time to maturity (in natural logarithm)\*Debt to Assets ratio, in order to capture the possible non-linear incidence of the term structure effect at different levels of leverage. We expect to have a positive effect on credit spreads in the regression regarding the time to maturity in a standalone basis, but the economic intuition points to a negative effect with the interaction term; as for a leverage company the more time to maturity the more opportunities to recover, if necessary, and thus the time promotes a less demanding risk premium.

**Figure 2 – Bond characteristics – Time to Maturity**

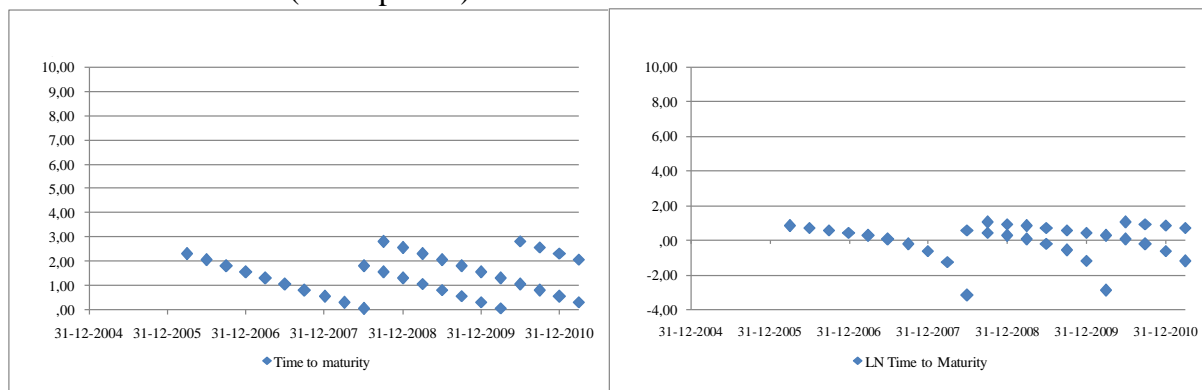
**Building Materials & Fixtures (1 company)**



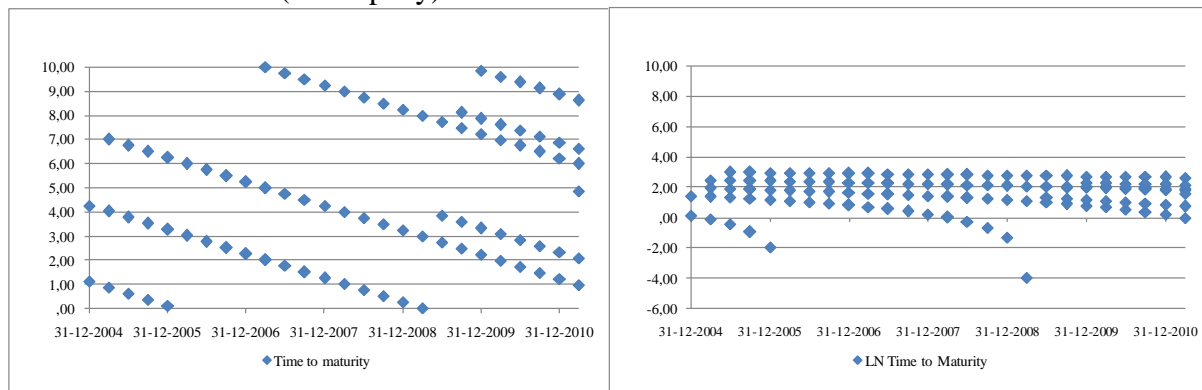
**Transportation Services (1 company)**



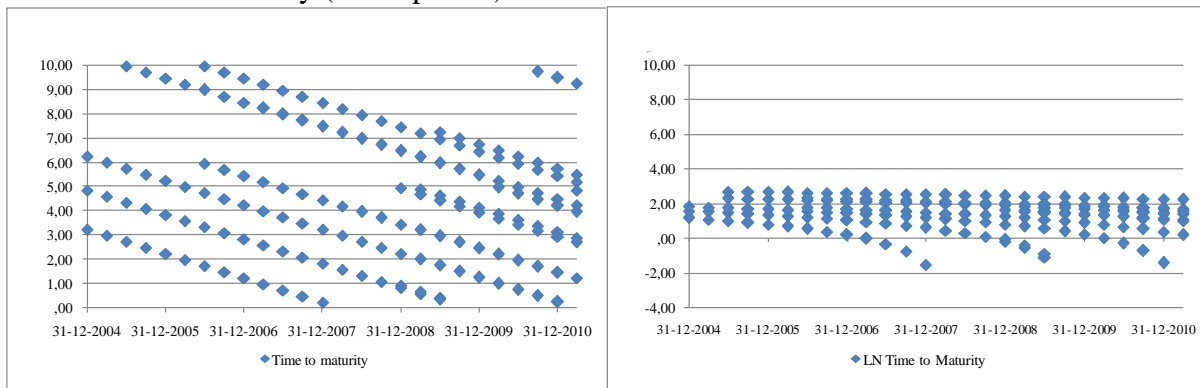
**Recreational Services (2 companies)**



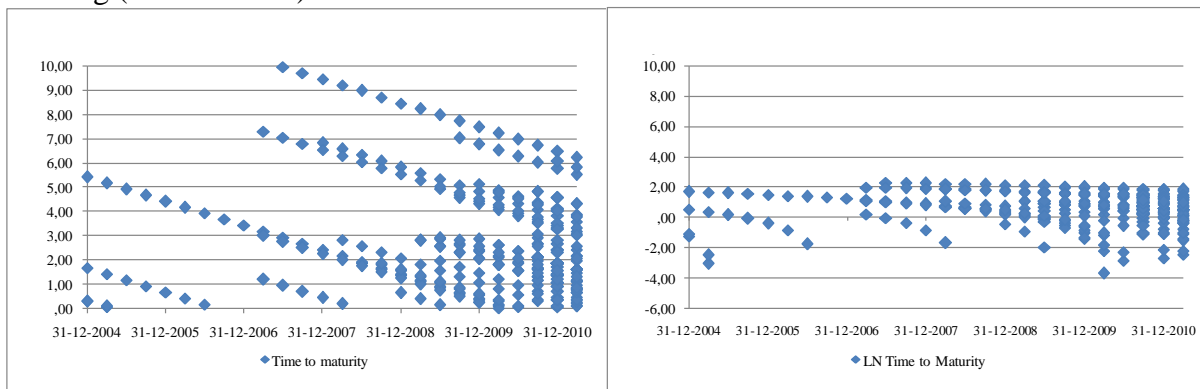
**Telecommunications (1 company)**



Conventional Electricity (2 companies)



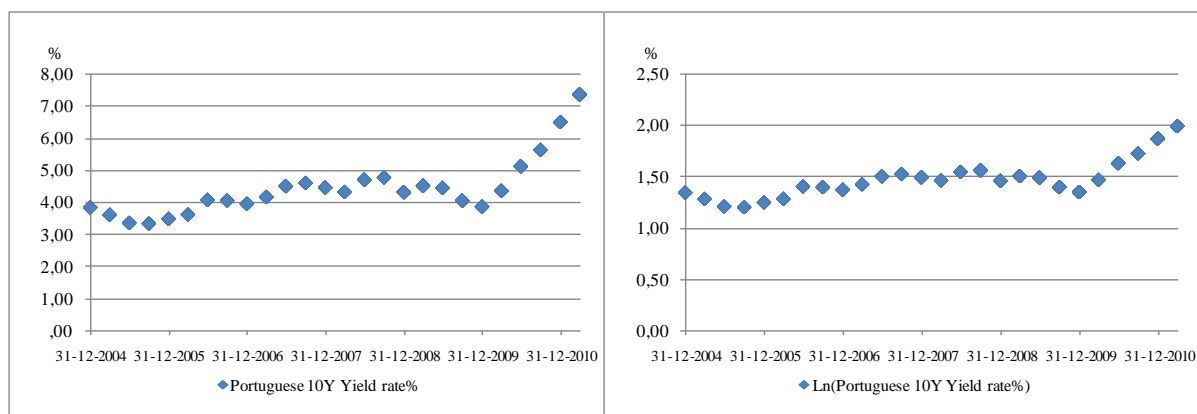
Banking (4 local banks)



4) Sovereign risk

We consider as sovereign risk the market perception of prospective economic conditions that are reflected in government debt yields. This variable is normalized by using the natural logarithm. This variable is an absolute prospective value for the country risk required by bondholders. We expect to have a positive effect on credit spreads in the regression from this independent variable. However, some sectors may be affected in different proportions, as the higher the yield spreads on public debt, the higher is the possibility of banking system vulnerability due to the traditional firm leverage on the financial industry. However, we have to be cautious on the analysis, due to high correlation that exists between this variable and the Public Debt to GDP ratio (Tables A.2 and A.3 in the appendix).

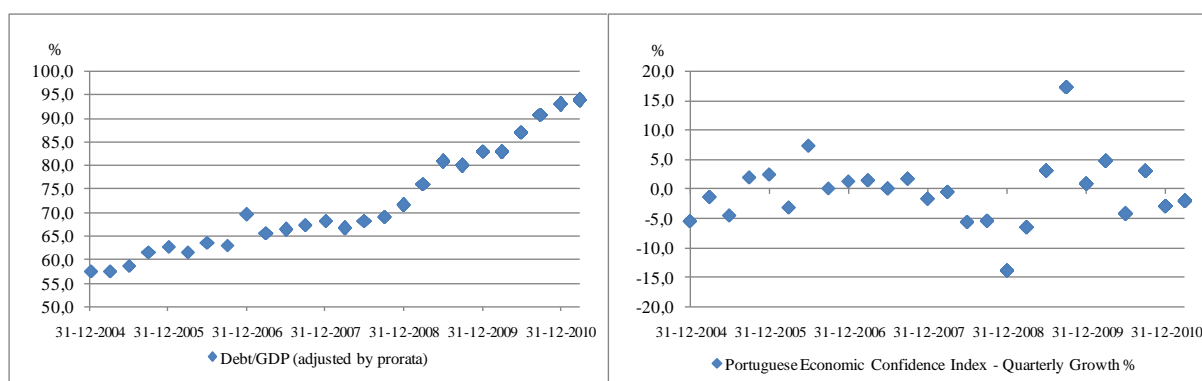
**Figure 3 – Sovereign Risk Proxy Indicator**



5) Macroeconomic conditions

In this set, we consider the macroeconomic conditions that impact mostly on credit corporate risk. After preliminary tests on the regression analysis using the stepwise method, several variables were excluded. The Public Debt to GDP ratio and the Economic Confidence Index growth were the variables which presented the better explanatory capacity. We expect to have a positive effect on credit spreads in the regression of the Public Debt ratio, and a negative effect from positive economic perspectives by the agents in the economy. The computation of quarterly Public Debt to GDP ratio was adjusted on first 3 quarters of the year by a *prorata temporis* effect.

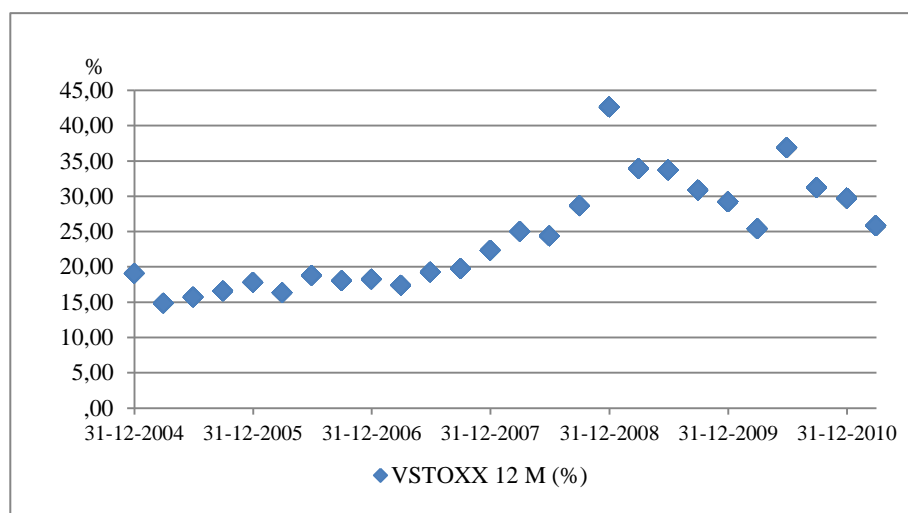
**Figure 4 – Portuguese Macroeconomic Indicators**



6) External factors

On preliminary work, we found that European bond indices Iboxx Euro Aggregate Corporate Total Return and Iboxx Euro High Yield Total Return, provided by Markit, were not statistically relevant, and were thus excluded. However, a forward looking indicator, as the volatility index VSTOXX 12M<sup>15</sup>, was retained as a measure of market expectations of long-term volatility based on the EURO STOXX 50 options prices. We expect to have a positive effect on credit spreads in the regression.

**Figure 5 – Volatility Index VSTOXX 12M**



**4.2. REGRESSION ANALYSIS**

We run linear regression analysis based on a model from Cavallo and Valenzuela (2010) for the unbalanced panel data. However our study is developed on a pooled regression model, as referred by Yaffe (2003) and Park (2009), because we have no country effects, and the time effects were not statistically significant<sup>16</sup>. We use two statistical techniques: multivariate linear regression and longitudinal analysis on linear regression with fixed effects for robustness tests.

<sup>15</sup> The EURO STOXX 50 Volatility Index (VSTOXX) measures the implied variance across all options of a given time to expiry. The options contract on the EURO STOXX 50 is one of the products of Eurex with the highest trading volume. This model has been jointly developed by Goldman Sachs and Deutsche Börse. The VSTOXX and its eight sub-indices are updated every five seconds. The VSTOXX is calculated on the basis of eight expiry months with a maximum time to expiry of two years.

<sup>16</sup> The results of a regression including date order as an additional independent variable present a decrease on the F-statistics from 324 to 297 and the T-statistics present a pSig. of 0,013 accepting the Ho:  $\beta = 0$  at 1% confidence level. The adjusted R Square improves marginally from 0.814 to 0.815.

We used a 5% confidence level in all analysis. We performed the calculations using the software “IBM SPSS Statistics 20” for the multivariate linear regression and the Stata IC for the longitudinal analysis.

#### 4.2.1. POOLED REGRESSION MODEL – TESTS AND RESULTS

As previously referred, our strategy was based on a sample of corporate OAS. We tested the explanatory relevance of proxy variables related with firm specific factors as size, financial performance, debt and industry effects, as we wanted to reflect the heterogeneity of the industry risks on Portuguese corporate bond market.

Our formula in the regression on the determinants (excluding the dummies) of the normalized OAS – the variable  $OAS_i$  – is the following:

$$\begin{aligned}
 OAS_i = & \beta_1 Size_i + \beta_2 \frac{Equity}{Debt}_i + \beta_3 \frac{Debt}{Assets}_i + \beta_4 \frac{Ebitda}{Assets}_i + \beta_5 Volatility_i + \beta_6 \frac{TtMDebt}{Assets}_i \\
 & + \beta_7 Portuguese10YYield_i + \beta_8 \frac{Debt}{GDP}_i + \beta_9 Confidence Index_i \\
 & + \beta_{10} VSTOXX12M_i + \varepsilon_i
 \end{aligned}$$

On Table 4 we present the results of a sequential increment of independent variables in our regression model.

The firm specific variables are depicted on column (1) and include dummy sector variable. The size and firm profitability coefficient are negative and statistically significant. The coefficients for Equity/Debt and leverage indicator (Debt/Assets) are positive and statistically significant. The coefficient for ratio Debt/Ebitda was insignificant, and statistically irrelevant. Although, these results are as expected, regardless of the low  $R_{adj}^2$  the irrelevancy of Debt/Ebitda was unexpected. The economic rational suggests that bondholders of riskier companies (high leverage) require higher spreads.

The introduction of firm volatility in column (2) improves  $R_{adj}^2$ , but the coefficient of Ebitda/Assets changes signal – contra intuitively – and its dimension becomes almost irrelevant, in spite of statistically significant.



**Table 4. Determinants of Portuguese Corporate OAS**
**Multivariate Linear Regression**

| Group Set                    | Variable           | (1)<br>OAS | (2)<br>OAS | (3)<br>OAS | (4)<br>OAS | (5)<br>OAS | (6)<br>OAS |
|------------------------------|--------------------|------------|------------|------------|------------|------------|------------|
| Constant <sup>17</sup>       |                    | 1.177      | -1.248     | -1.080     | -3.456     | -3.098     | -2.943     |
|                              |                    | 0.007      | 0.001      | 0.004      | 0.000      | 0.000      | 0.000      |
|                              | Size               | -0.144     | -0.069     | -0.086     | -0.161     | -0.209     | -0.233     |
|                              |                    | 0.000      | 0.012      | 0.003      | 0.000      | 0.000      | 0.000      |
| 1. Firm specific             | Equity/Debt        | 0.004      | 0.003      | 0.003      | 0.001      | 0.001      | 0.001      |
|                              |                    | 0.000      | 0.000      | 0.000      | 0.000      | 0.003      | 0.001      |
|                              | Debt /Assets       | 0.013      | 0.009      | 0.007      | -0.002     | -0.006     | -0.007     |
|                              |                    | 0.000      | 0.001      | 0.016      | 0.217      | 0.001      | 0.000      |
|                              | Ebitda/Assets      | -0.029     | 0.018      | 0.015      | 0.020      | 0.019      | 0.017      |
|                              |                    | 0.000      | 0.002      | 0.009      | 0.000      | 0.000      | 0.000      |
| 2. Firm market value         | Volatility         |            | 0.054      | 0.055      | 0.044      | 0.034      | 0.027      |
|                              |                    |            | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      |
| 3. Bond characteristics      | TtM                |            |            | 0.151      | 0.207      | 0.206      | 0.186      |
|                              | Debt/Assets        |            |            | 0.053      | 0.000      | 0.000      | 0.000      |
| 4. Sovereign risk            | Portuguese 10Yield |            |            |            | 2.541      | 1.177      | 1.501      |
|                              |                    |            |            |            | 0.000      | 0.000      | 0.000      |
| 5. Macro economic conditions | Debt/GDP           |            |            |            |            | 0.035      | 0.025      |
|                              |                    |            |            |            |            | 0.000      | 0.000      |
|                              | Confidence Index   |            |            |            |            | -0.022     | -0.013     |
|                              |                    |            |            |            |            | 0.000      | 0.000      |
| 6. External factors          | VSTOXX 12M         |            |            |            |            |            | 0.021      |
|                              |                    |            |            |            |            |            | 0.000      |
| Observations                 |                    | 741        | 741        | 741        | 741        | 741        | 741        |
| F Statistics                 |                    | 57.14      | 165.07     | 138.70     | 361.78     | 348.07     | 324.57     |
| Sig.                         |                    | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      |
| R-squared (Adjusted)         |                    | 0.233      | 0.526      | 0.528      | 0.773      | 0.808      | 0.814      |
| Dummies Sector               |                    | y          | y          | y          | y          | y          | y          |

We introduced the bond characteristic factors in column (3): the variable Time to Maturity was statistically insignificant but the interaction term between time to maturity and leverage ratio (Debt/Assets) is significant. The coefficient on the latter presents, however, an

<sup>17</sup> Constant value is presented using a regression without sector dummy variables.

unexpected sign. The reason may be related with the sample (relatively high leveraged companies), and probably shorter durations on the bond issues (the average time to maturity is 3 year). These facts in conjunction with a country specific risk environment may lead to a higher risk premium, because bondholders may not perceive firm capacity to accomplish debt obligations on a shorter term basis. The Debt/Assets ratio on a stand-alone basis, although statistically significant is irrelevant.

In column (4), the sovereign risk proxy variable is included, and that results on a relevant improvement on  $R_{adj}^2$  that increases to 0.773. This variable is statistically significant, and has a relevant contribute to variance. The coefficient sign enters the regression with the expected sign. The introduction of this variable leads to a sign change on Debt/Assets ratio that becomes almost irrelevant ( $\beta = 0,002$ ).

Country specific indicators – macroeconomic variables – are included in column (5) with all the signs according to expectations, and statistically significant. The companies benefit from positive economic perspectives, but are penalized when the ratio public debt to GDP deteriorates. The introduction of these variables impacts on the size of the point estimates of sovereign risk, especially on the Portuguese 10Yield variable. The effect is the result of a high correlation between the public debt ratio and this country risk proxy. We understand that market risk perception derived from the sovereign debt crisis, on peripheral countries of the Eurozone, is a key driver for this high correlation. However, we include the variable to assess the impact on sector specific effects.

The external factor is introduced in the last column (6). The volatility index on Eurostoxx50 has a positive effect on corporate credit spread, and is statistically significant. However, it does not have a relevant impact on the  $R_{adj}^2$ .

The global results of the linear regression indicate that firm specific-variables, market value of the firm, bond characteristics, sovereign risks, country factors and external factors are all determinants of the corporate OAS.

However, contrary to our expectations, bond characteristic's variable enters the regression with sign opposite to economic intuition. Firm specific variables – Equity/Debt and Debt/Assets – although statistically significant, are irrelevant in determining the OAS. The Equity/Debt enters the regression with a negative sign, which is contrary to our expectations. The high leverage of the firms included in the sample as well as the short duration effect, that may potentiate the effect of stressed companies explain the Bond characteristic effect on the OAS. Companies are financed, primarily, by the banking system, or by short term monetary instruments, and, secondarily by bond issues in the capital markets. Therefore, on a stressed situation with short term negative outlook – which was the record for last years in the

Portuguese economy – the longer the maturity of the bond the higher are the possibilities of recovery. Hence, there may be better conditions to comply with debt obligations, and thus a possible decrease on default risk can occur. On the contrary, if the company is highly leveraged, introducing the time effect can potentiate the risk of default. This, probably, also results from the data used to run the regression analysis due to constraints on availability.

We were expecting a relevant and positive impact on the Debt/Ebitda ratio, as it is an indicator of the firm’s capacity to generate earnings from the business. The higher this capacity (thus the lower the ratio), the higher the negative impact on the OAS. However, it was not neither relevant nor statistically significant. This needs further investigation, and probably a broader range of sector in future samples. The irrelevance of this indicator is unexpected. Also unexpected is the negative impact on the leverage ratio, although we can point the irrelevance on determining the OAS. The collinearity amongst firm-specific variables can also be an explanation for the decreasing impact for this ratio.

In Table 5, we perform the regression excluding the Recreational sector, which accounts for 2 sportive firms (Football clubs) where bondholders may consider different reasons to invest in this type of firms as referred by Ameriks et al. (2009). All results on impacts stand, but there are some changes on the coefficients: especially on the bond characteristics time control effect, where the impact size increases from  $\beta=0,186$  to  $\beta=0,517$ . There is also an improvement on the  $R_{adj}^2$ .

**Table 5. Determinants of Portuguese Corporate OAS – Excluding Recreational Sector**  
**Multivariate Linear Regression**

| Group Set              | Variable      | (1)<br>OAS | (2)<br>OAS | (3)<br>OAS | (4)<br>OAS | (5)<br>OAS | (6)<br>OAS |
|------------------------|---------------|------------|------------|------------|------------|------------|------------|
| Constant <sup>18</sup> |               | -1.734     | -2.339     | -2.260     | -4.699     | -4.499     | -4.425     |
|                        |               | 0.012      | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      |
| 1. Firm specific       | Size          | 0.107      | 0.004      | -0.004     | -0.079     | -0.105     | -0.117     |
|                        |               | 0.060      | 0.935      | 0.924      | 0.006      | 0.000      | 0.000      |
|                        | Equity/Debt   | 0.005      | 0.004      | 0.004      | 0.001      | 0.001      | 0.001      |
|                        |               | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      |
|                        | Debt /Assets  | 0.014      | 0.013      | 0.007      | -0.004     | -0.008     | -0.009     |
|                        |               | 0.000      | 0.000      | 0.022      | 0.048      | 0.000      | 0.000      |
|                        | Ebitda/Assets | 0.006      | 0.026      | 0.025      | 0.032      | 0.032      | 0.032      |
| 2. Firm market value   |               | 0.548      | 0.001      | 0.001      | 0.000      | 0.000      | 0.000      |
|                        | Volatility    |            | 0.058      | 0.059      | 0.048      | 0.037      | 0.031      |
|                        |               |            | 0.000      | 0.000      | 0.000      | 0.000      | 0.000      |

<sup>18</sup> Constant value is presented using a regression without the sector dummy variables.

## Determinants of Corporate Risk using Option-Adjusted Spreads: The case of Portugal

|                              |                     | (1)    | (2)     | (3)     | (4)     | (5)     | (6)     |
|------------------------------|---------------------|--------|---------|---------|---------|---------|---------|
| Group Set                    | Variable            | OAS    | OAS     | OAS     | OAS     | OAS     | OAS     |
| 3. Bond characteristics      | TtM                 |        |         | 0.376   | 0.486   | 0.513   | 0.517   |
|                              | Debt/Assets         |        |         | 0.000   | 0.000   | 0.000   | 0.000   |
| 4. Sovereign risk            | Portuguese 10YYield |        |         |         | 2.624   | 1.318   | 1.543   |
|                              |                     |        |         |         | 0.000   | 0.000   | 0.000   |
| 5. Macro economic conditions | Debt/GDP            |        |         |         |         | 0.033   | 0.026   |
|                              |                     |        |         |         |         | 0.000   | 0.000   |
| 5. Macro economic conditions | Confidence Index    |        |         |         |         | -0.023  | -0.016  |
|                              |                     |        |         |         |         | 0.000   | 0.000   |
| 6. External factors          | VSTOXX 12M          |        |         |         |         |         | 0.016   |
|                              |                     |        |         |         |         |         | 0.000   |
| Observations                 |                     | 708    | 708     | 708     | 708     | 708     | 708     |
| F Statistics                 |                     | 47.883 | 153.123 | 133.018 | 425.317 | 415.651 | 381.910 |
| Sig.                         |                     | 0.000  | 0.000   | 0.000   | 0.000   | 0.000   | 0.000   |
| R-squared (Adjusted)         |                     | 0.210  | 0.518   | 0.528   | 0.808   | 0.841   | 0.843   |
| Dummies Sector               |                     | y      | y       | y       | y       | y       | y       |

In relation to adherence per sector (Table 6), we run regression including sector dummies, and the results point to a relevant explanation of OAS except for sector 2 – Recreational Services which presents a relatively low  $R_{adj}^2$  of 0,560.

**Table 6. Determinants of Portuguese Corporate OAS – Summary Information per Sector - Multivariate Linear Regression**

| OAS                  | Sector 0 | Sector 1 | Sector 2 | Sector 3 | Sector 4 | Sector 5 |
|----------------------|----------|----------|----------|----------|----------|----------|
| Observations         | 26       | 53       | 33       | 119      | 183      | 327      |
| F Statistics         | 33.401   | 108.703  | 5.070    | 38.561   | 146.305  | 330.593  |
| Sig.                 | 0.000    | 0.000    | 0.001    | 0.000    | 0.000    | 0.000    |
| R-squared (Adjusted) | 0.928    | 0.954    | 0.560    | 0.761    | 0.889    | 0.910    |

Due to the specificity of banking sector, we also run an additional regression for this sector excluding the non-significant variables (with a 5% confidence interval). The results of this

new specification are presented in Table 7 column (7). The  $R_{adj}^2$  is relatively high, and there is a change of determinants for the OAS. The firm specific variables are statistically insignificant, and the main impacts are from sovereign risks and bond characteristics. This is in line with the work by Gerlach et al. (2010), which refers that “when aggregate risk increases, countries with large banking sectors and low equity ratios in the banking sector experience greater widening in yield spreads, suggesting that financial markets perceive a larger risk that governments will have to rescue banks, increasing public debt and therefore sovereign risk.”

There are, however, high levels of collinearity between the variables from sovereign risk set, and between the Debt to GDP ratio. In this regression the signs of the coefficients are unchanged from base regression.

**Table 7. Determinants of Portuguese Corporate OAS – Banking Sector**

**Multivariate Linear Regression**

| Group Set                    | Variable           | (1)<br>OAS | (2)<br>OAS | (3)<br>OAS | (4)<br>OAS | (5)<br>OAS | (6)<br>OAS | (7)<br>OAS |
|------------------------------|--------------------|------------|------------|------------|------------|------------|------------|------------|
| Constant                     |                    | 3.641      | 3.382      | 3.083      | -4.465     | -6.943     | -7.906     | -7.062     |
|                              |                    | 0.006      | 0.002      | 0.006      | 0.000      | 0.000      | 0.000      | 0.000      |
|                              | Size               | -0.380     | -0.681     | -0.644     | -0.192     | 0.003      | 0.052      |            |
| 1. Firm specific             |                    | 0.005      | 0.000      | 0.000      | 0.008      | 0.964      | 0.407      |            |
|                              | Equity/Debt        | 0.008      | 0.008      | 0.008      | 0.003      | 0.001      | 0.000      |            |
|                              |                    | 0.000      | 0.000      | 0.000      | 0.000      | 0.201      | 0.430      |            |
|                              | Debt /Assets       | -0.154     | -0.083     | -0.065     | 0.018      | 0.028      | 0.034      |            |
|                              |                    | 0.064      | 0.228      | 0.350      | 0.665      | 0.429      | 0.308      |            |
|                              | Ebitda/Assets      | -0.396     | 0.887      | 0.823      | 0.402      | 0.211      | 0.121      |            |
|                              |                    | 0.038      | 0.000      | 0.000      | 0.001      | 0.041      | 0.211      |            |
| 2. Firm market value         | Volatility         |            | 0.071      | 0.070      | 0.054      | 0.033      | 0.014      | 0.010      |
|                              |                    |            | 0.000      | 0.000      | 0.000      | 0.000      | 0.002      | 0.004      |
| 3. Bond characteristics      | TtM                |            |            | -2.241     | -2.634     | -2.305     | -2.546     | -2.450     |
|                              | Debt/Assets        |            |            | 0.079      | 0.001      | 0.000      | 0.000      | 0.000      |
| 4. Sovereign risk            | Portuguese 10Yield |            |            |            | 2.701      | 1.264      | 1.858      | 1.973      |
|                              |                    |            |            |            | 0.000      | 0.000      | 0.000      | 0.000      |
| 5. Macro economic conditions | Debt/GDP           |            |            |            |            | 0.050      | 0.039      | 0.038      |
|                              |                    |            |            |            |            | 0.000      | 0.000      | 0.000      |
|                              | Confidence Index   |            |            |            |            | -0.021     | -0.005     |            |
|                              |                    |            |            |            |            | 0.000      | 0.226      |            |

| Group Set            | Variable | (1)    | (2)    | (3)    | (4)     | (5)     | (6)     | (7)     |
|----------------------|----------|--------|--------|--------|---------|---------|---------|---------|
|                      |          | OAS    | OAS    | OAS    | OAS     | OAS     | OAS     | OAS     |
| 6. External factors  | VSTOXX   |        |        |        |         |         | 0.039   | 0.042   |
|                      | 12M      |        |        |        |         |         | 0.000   | 0.000   |
| Observations         |          | 327    | 327    | 327    | 327     | 327     | 327     | 327     |
| F Statistics         |          | 58.561 | 98.514 | 83.148 | 276.104 | 316.585 | 330.593 | 649.344 |
| Sig.                 |          | 0.000  | 0.000  | 0.000  | 0.000   | 0.000   | 0.000   | 0.000   |
| R-squared (Adjusted) |          | 0.414  | 0.599  | 0.602  | 0.855   | 0.897   | 0.910   | 0.909   |
| Dummies Sector       |          | n      | n      | n      | n       | n       | n       | n       |

Related with residual analysis for the regression model, as referred in Table 8 and Figures 6-8, we find that results are relatively robust, in spite of some outliers.

**Table 8. Determinants of Portuguese Corporate OAS – Residual Statistics**

**Multivariate Linear Regression**

|                      | Residuals Statistics |           |        |                |     |
|----------------------|----------------------|-----------|--------|----------------|-----|
|                      | Minimum              | Maximum   | Mean   | Std. Deviation | N   |
| Predicted Value      | -1.440241            | 3.123523  | 0.5225 | 0.88000        | 741 |
| Residual             | -1.5110584           | 2.2142003 | 0.0000 | 0.41735        | 741 |
| Std. Predicted Value | -2.230               | 2.956     | 0.000  | 1.000          | 741 |
| Std. Residual        | -3.596               | 5.269     | 0.000  | 0.993          | 741 |

**Figure 6 – Histogram of OAS Regression Standardized Residual**

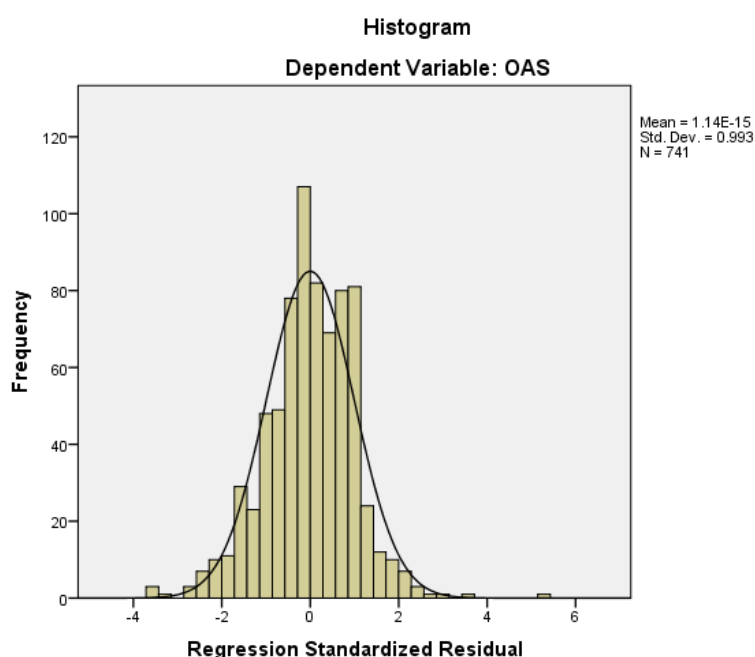


Figure 7 – OAS Regression Standardized Residual – Cumulative Probability

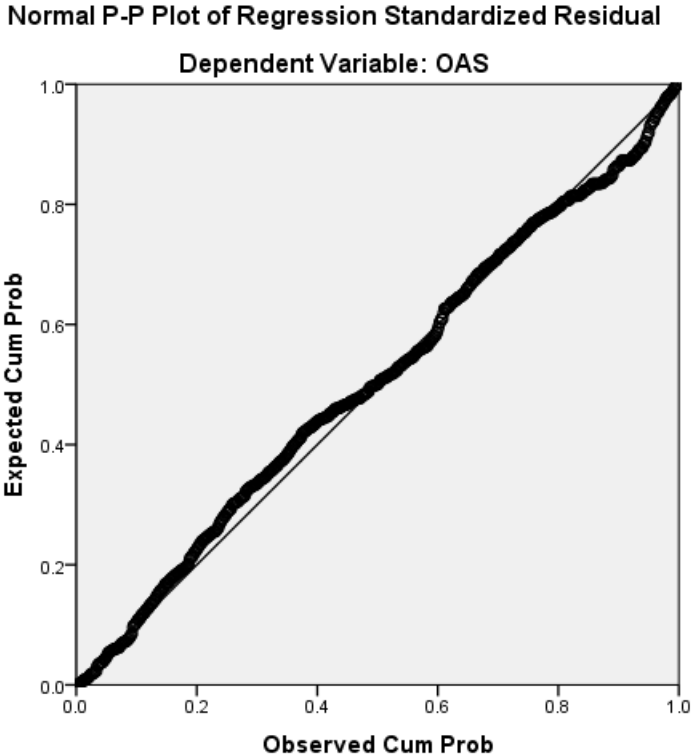
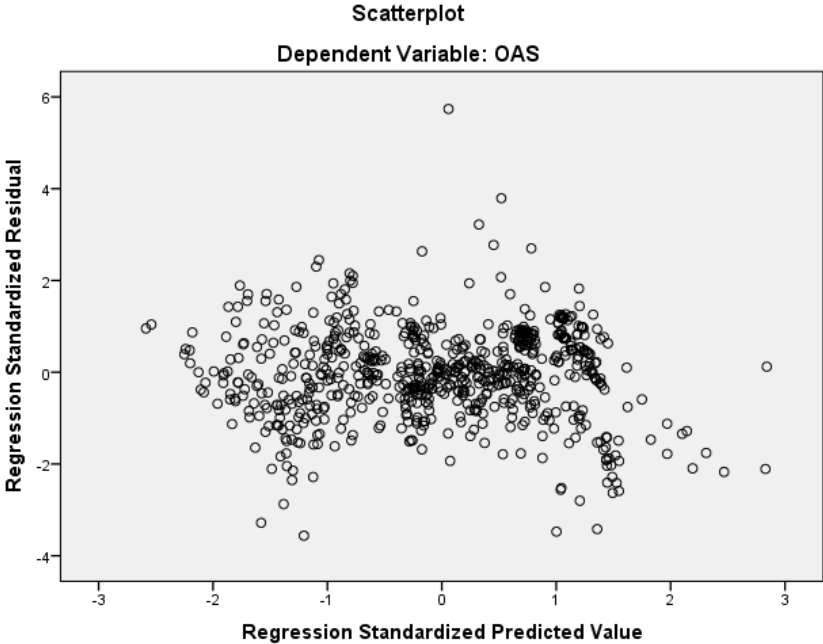


Figure 8 – Scatter Plot OAS Regression Standardized Residual and Predicted Value



Nevertheless, we identify relatively high levels of collinearity between some of the independent variables that will focus our attention in future analysis, which will have to incorporate a broader spectrum of industry sectors. In this study, we developed some procedures to overcome these effects.

### ***Robustness Tests***

In order to attenuate the multicollinearity issues identified in the base regression by tolerance indicator and variance inflation factor (VIF) – three of the explanatory variables have a value inferior or equal to 2 and the rest are between this level and 7.5 – as well as by the Eigenvalue indicator and Condition Index – there are four variables with value superior to 15 – we rerun the regression using Zscores of the independent variables<sup>19</sup>. We defined a model for the OAS using normalized predictors based on the 10 independent variables of the pool regression.

Results on the Eigenvalues and condition indices are improved, as indicated on Table 9.

**Table 9. Determinants of Portuguese Corporate OAS - Multivariate Linear Regression – Using Zscores -Collinearity Diagnostics**

| <b>Collinearity Diagnostics</b> |                   |                        |
|---------------------------------|-------------------|------------------------|
| <b>Model Dimension</b>          | <b>Eigenvalue</b> | <b>Condition Index</b> |
| 1                               | 4.275             | 1.000                  |
| 2                               | 1.842             | 1.523                  |
| 3                               | 1.062             | 2.009                  |
| 4                               | 1.000             | 2.068                  |
| 5                               | 0.942             | 2.130                  |
| 6                               | 0.763             | 2.367                  |
| 7                               | 0.443             | 3.086                  |
| 8                               | 0.308             | 3.728                  |
| 9                               | 0.200             | 4.621                  |
| 10                              | 0.091             | 6.866                  |
| 11                              | 0.071             | 7.746                  |

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<sup>19</sup> We run auxiliary regression on the normalized variables in order to eliminate the level of collinearity.



**Table 10. Determinants of Portuguese Corporate OAS - Multivariate Linear Regression – Using Zscores - Collinearity Statistics**

| Model Dimension             | Coefficients |       | Collinearity Statistics |       |
|-----------------------------|--------------|-------|-------------------------|-------|
|                             | Coefficient  | Sig.  | Tolerance               | VIF   |
|                             |              |       |                         |       |
| Constant                    | 0.523        | 0.000 |                         |       |
| Zscore (Size)               | -0.341       | 0.000 | 0.294                   | 3.399 |
| Zscore (EquityDebt)         | 0.100        | 0.001 | 0.242                   | 4.134 |
| Zscore (DebtAssets)         | -0.151       | 0.000 | 0.148                   | 6.758 |
| Zscore (EBITDAAssets)       | 0.106        | 0.000 | 0.484                   | 2.067 |
| Zscore (Volatility)         | 0.307        | 0.000 | 0.315                   | 3.172 |
| Zscore (TtMDebtAssets)      | 0.079        | 0.000 | 0.542                   | 1.845 |
| Zscore (Portuguese10YYield) | 0.332        | 0.000 | 0.199                   | 5.035 |
| Zscore (DebtGDP)            | 0.299        | 0.000 | 0.133                   | 7.507 |
| Zscore (ConfidenceIndex)    | -0.075       | 0.000 | 0.559                   | 1.789 |
| Zscore (VSTOXX12M)          | 0.144        | 0.000 | 0.255                   | 3.926 |

However, the collinearity statistics reported on Table 10 are unimproved after the regression. This is because the Z-score transformation does not change the correlation between two variables. As a multicollinearity diagnostic, the condition index is useful for flagging datasets that could cause numerical estimation problems in algorithms that do not internally rescale the independent variables. The Z-score transformation solves this problem, but for improving the variance inflation it is necessary to use another procedure – factor analysis.

**Table 11. Determinants of Portuguese Corporate OAS - Multivariate Linear Regression – Using Factor Components Scores**

| Model Dimension      | Coefficients |       | Collinearity Statistics |       |
|----------------------|--------------|-------|-------------------------|-------|
|                      | Coefficient  | Sig.  | Tolerance               | VIF   |
|                      |              |       |                         |       |
| Constant             | 0.523        | 0.000 |                         |       |
| Regr factor score 1  | 0.636        | 0.000 | 1.000                   | 1.000 |
| Regr factor score 2  | -0.156       | 0.000 | 1.000                   | 1.000 |
| Regr factor score 3  | 0.454        | 0.000 | 1.000                   | 1.000 |
| Regr factor score 4  | -0.074       | 0.000 | 1.000                   | 1.000 |
| Regr factor score 5  | -0.087       | 0.000 | 1.000                   | 1.000 |
| Regr factor score 6  | -0.071       | 0.000 | 1.000                   | 1.000 |
| Regr factor score 7  | 0.182        | 0.000 | 1.000                   | 1.000 |
| Regr factor score 8  | 0.283        | 0.000 | 1.000                   | 1.000 |
| Regr factor score 9  | -0.084       | 0.000 | 1.000                   | 1.000 |
| Regr factor score 10 | 0.036        | 0.022 | 1.000                   | 1.000 |

We used the factor analysis to create a set of independent variables that are uncorrelated and fit the dependent variable as well as the original explanatory variables. These new variables are used on a regression where the independent variables are the principal components extracted from the Z-scores<sup>20</sup>. The results of the regression confirm that the variables that are statistically significant do not change from the original regression (Table 11).

In addition to these procedures we also run a regression on differences. The model specification changed, but five variables from the original regression were statistically significant – volatility, Time to Maturity\*Debt/Assets, Portuguese 10YYield, Economic Confidence Index and VSTOXX12M. The  $R_{adj}^2$  is 0.423, which is relatively low, but there are no issues with collinearity–VIF is below 2 for all variables and Condition Index is below 3. The signs of the coefficients are in accordance with our expectations.

With this test we can overcome the collinearity issues. However it is necessary to investigate further types of independent variables, because we anticipate that the explanation of the changes in the OAS is also related to events and communications to the market. At this stage, this analysis is outside the scope of current study, but it is interesting subject for future research.

#### 4.2.2. LONGITUDINAL ANALYSIS – TESTS AND RESULTS

To complement the analysis with the pooling regression model we also run a linear regression for panel data using StataIC (Park, 2009). As we have an unbalanced panel data with a cross section variable (the bond issue) observable in different moments, we tested a fixed effect<sup>21</sup> to analyse group differences in intercept and also the autocorrelation effect using a autoregressive model with 1 period lag – AR(1).

The initial results, without the time lag, presented on Table 12, indicate a change of two explanatory variables, compared with the multivariate linear regression. The size is not statistically significant and was dropped. The time to maturity enters the regression with a significant effect but an opposite sign to economic intuition. The negative impact is explained by the same reasons that support our interpretation on the Time to Maturity\*Debt/Asset. The high leverage ratio of the companies favours the credit risk for longer maturities.

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<sup>20</sup> The model fit is the same as for the model with the original explanatory variables.

<sup>21</sup> We tested fixed effects against random effects using the Hausman statistic. The result ( $\chi^2(10) = 80.26$ ;  $\text{Prob} > \chi^2 = 0.0000$ ) lead to reject the null that the two methods are OK in favour of the alternative hypothesis that one is OK (fixed effects) and one isn't (random effects).

**Table 12. Determinants of Portuguese Corporate OAS - Longitudinal Analysis - Multivariate Linear Regression – Fixed Effects**

| <b>Fixed-effects (within) regression</b> |          |                    |                                    | Observations        | 741                  |          |
|--|----------|--------------------|------------------------------------|---------------------|----------------------|----------|
| Group variable: Bond                     |          |                    |                                    | N. Groups           | 97                   |          |
|  |          |                    |                                    | Obs. Per group: min | 1                    |          |
| R-sq:                                    | within   | 0.7934             |                                    | avg.                | 7.6                  |          |
|  | between  | 0.6135             |                                    | max                 | 26                   |          |
|  | overall  | 0.6500             |                                    | F Statistics        | 243.41               |          |
| Corr (ui, Xb) = 0.1574                   |          |                    |                                    | Sig.                | 0.0000               |          |
| Explanatory Variables                    | Coef.    | STD Err            | t                                  | Sig.                | (95% conf. Interval) |          |
| <b>Equity/Debt</b>                       | 0.00106  | 0.00021            | 5.02                               | 0.000               | 0.00065              | 0.00148  |
| <b>Debt /Assets</b>                      | 0.01533  | 0.00264            | 5.81                               | 0.000               | 0.01015              | 0.02020  |
| <b>Ebitda/Assets</b>                     | 0.01227  | 0.00557            | 2.20                               | 0.028               | 0.00134              | 0.02320  |
| <b>Volatility</b>                        | 0.02313  | 0.00205            | 11.26                              | 0.000               | 0.01910              | 0.02716  |
| <b>Time to Maturity</b>                  | -0.26605 | 0.03266            | -8.15                              | 0.000               | -0.33019             | -0.20191 |
| <b>TtM Debt/Assets</b>                   | 0.35985  | 0.07162            | 5.02                               | 0.000               | 0.21922              | 0.50049  |
| <b>Portuguese 10YYield</b>               | 1.28724  | 0.11162            | 11.53                              | 0.000               | 1.06805              | 1.50644  |
| <b>Debt/GDP</b>                          | 0.01019  | 0.00292            | 3.49                               | 0.001               | 0.00446              | 0.01593  |
| <b>Confidence Index</b>                  | -0.01606 | 0.00252            | -6.37                              | 0.000               | -0.02101             | -0.01111 |
| <b>VSTOXX 12M</b>                        | 0.01532  | 0.00350            | 4.37                               | 0.000               | 0.00844              | 0.02219  |
| <b>Constant</b>                          | -3.83495 | 0.20100            | -19.08                             | 0.000               | -4.22965             | -3.44025 |
|  | sig u    | 0.57747            |                                    |                     |                      |          |
|  | sig e    | 0.28338            |                                    |                     |                      |          |
|  | rho      | 0.80592            | (fraction of variance due to u i ) |                     |                      |          |
| F test that all u i = 0                  |          | F (97;634) = 13.35 | Sig = 0.0000                       |                     |                      |          |

When we introduce (Table 13) the time lag effect – AR(1) – the determinants of the OAS remain stable and there is no improvement in the model – the overall  $R^2$  is c. 0.63.

**Table 13. Determinants of Portuguese Corporate OAS - Longitudinal Analysis - Multivariate Linear Regression – Fixed Effects and AR(1)**

| <b>Fixed-effects (within) regression with AR(1) disturbance</b> |              |                    |   | Observations        | 644                         |          |
|---|--------------|--------------------|---|---------------------|-----------------------------|----------|
| Group variable: Bond  |              |                    |   | N. Groups           | 87                          |          |
|   |              |                    |   | Obs. Per group: min | 1                           |          |
| R-sq:   | Within       | 0.7919             |   | avg.                | 7.4                         |          |
|   | Between      | 0.5546             |   | max                 | 25                          |          |
|   | Overall      | 0.6300             |   | F Statistics        | 208.12                      |          |
| Corr (u <sub>i</sub> , X <sub>b</sub> ) = 0.1467                |              |                    |   | Sig.                | 0.0000                      |          |
| <b>Explanatory Variables</b>                                    | <b>Coef.</b> | <b>STD Err</b>     | <b>t</b>                                      | <b>Sig.</b>         | <b>(95% conf. Interval)</b> |          |
| <b>Equity/Debt</b>  | 0.00099      | 0.00022            | 4.57  | 0.000               | 0.00056                     | 0.00141  |
| <b>Debt /Assets</b>   | 0.01516      | 0.00280            | 5.42  | 0.000               | 0.00967                     | 0.02066  |
| <b>Ebitda/Assets</b>  | 0.01322      | 0.00586            | 2.26  | 0.024               | 0.00171                     | 0.02473  |
| <b>Volatility</b>   | 0.02296      | 0.00219            | 10.47   | 0.000               | 0.01865                     | 0.02727  |
| <b>Time to Maturity</b>   | -0.28268     | 0.03614            | -7.83   | 0.000               | -0.35387                    | -0.21187 |
| <b>TtM Debt/Assets</b>  | 0.35450      | 0.07623            | 4.65  | 0.000               | 0.20476                     | 0.50424  |
| <b>Portuguese 10Yield</b>                                       | 1.30427      | 0.11827            | 11.03   | 0.000               | 1.07195                     | 1.53658  |
| <b>Debt/GDP</b>   | 0.00823      | 0.00307            | 2.68  | 0.008               | 0.00220                     | 0.01424  |
| <b>Confidence Index</b>   | -0.01492     | 0.00273            | -5.47   | 0.000               | -0.02028                    | -0.00956 |
| <b>VSTOXX 12M</b>   | 0.01474      | 0.00376            | 3.92  | 0.000               | 0.00735                     | 0.02213  |
| <b>Constant</b>   | -3.67427     | 0.21761            | -16.88  | 0.000               | -4.10173                    | -3.24680 |
|   | Rho ar       | 0                  |   |                     |                             |          |
|   | sig u        | 0.57747            |   |                     |                             |          |
|   | sig e        | 0.28363            |   |                     |                             |          |
|   | rho          | 0.83903            | (fraction of variance due to u <sub>i</sub> ) |                     |                             |          |
| F test that all u <sub>i</sub> = 0                              |              | F (86;547) = 12.95 |   | Sig = 0.0000        |                             |          |

However, the results on the correlation matrix are less severe than in the multivariate linear model as on the following table.

**Table 14. Correlation Matrix of explanatory variables - Longitudinal Analysis - Multivariate Linear Regression – Fixed Effects and AR(1)**

| Explanatory Variables | Equity/Debt | Debt /Assets | Ebitda/Assets | Volatility | Time to Maturity | TtM Debt/Assets | Portuguese 10YYield | Debt/GDP | Confidence Index | VSTOXX 12M |
|-----------------------|-------------|--------------|---------------|------------|------------------|-----------------|---------------------|----------|------------------|------------|
| Equity/Debt           | 1           |              |               |            |                  |                 |                     |          |                  |            |
| Debt /Assets          | 0.5849      | 1            |               |            |                  |                 |                     |          |                  |            |
| Ebitda/Assets         | 0.0952      | -0.0797      | 1             |            |                  |                 |                     |          |                  |            |
| Volatility            | 0.1257      | 0.1046       | 0.1403        | 1          |                  |                 |                     |          |                  |            |
| Time to Maturity      | 0.0690      | 0.2495       | 0.1571        | 0.0830     | 1                |                 |                     |          |                  |            |
| TtM Debt/Assets       | -0.0009     | -0.1852      | -0.1685       | 0.0658     | -0.6436          | 1               |                     |          |                  |            |
| Portuguese 10YYield   | -0.0578     | -0.0303      | 0.0144        | -0.1040    | 0.0525           | -0.0118         | 1                   |          |                  |            |
| Debt/GDP              | -0.0628     | 0.0744       | 0.1556        | 0.1339     | 0.3136           | -0.0324         | -0.6700             | 1        |                  |            |
| Confidence Index      | -0.1109     | -0.1008      | -0.0735       | -0.2973    | -0.0203          | -0.0270         | 0.5462              | -0.5118  | 1                |            |
| VSTOXX 12M            | -0.1072     | -0.2117      | -0.1319       | -0.6834    | -0.0355          | -0.0431         | 0.3689              | -0.4981  | 0.5641           | 1          |

#### 4.3. COMPARING WITH THE LITERATURE

The results of our study in comparison with the findings of Cavallo and Valenzuela (2010), Huang and Kong (2003) and Collin-Dufresne et al. (2001), are aligned with the effect of the variables non-controlled by the firm. However, we found some differences related with the firm specific variables and bond characteristics.

Our study suggests that the effect of the bond's time to maturity in the Portuguese market have a negative impact on the spreads. A probable justification could be the bondholders risk perception on the companies' ability to pay the debt obligations on a longer term. Thus, the leverage effect with the time control results on a contra intuitive effect on the spreads. An additional reason for this to happen is the short duration of the bonds.

In relation to the firm specific variables, our results may be biased by the sample data as the majority of the companies (excluding sector of Building and Construction – a cement company with multinational operations) focus on local trade and services.

## 5. CONCLUSIONS

We find evidence that suggests the Portuguese corporate bond spreads can be explained by firm-specific variables, bond characteristics, sovereign risk, macroeconomic variables and global factors. The bond spread measure by the OAS provided us with a broader sample to run the regression analysis, as we overcome the faults from traditional yield spread comparisons.

Unexpected results on the coefficient signals of some of the variables, mainly bond characteristics variables and Debt to Assets ratio in the firm specific set, are grounds for further investigation, as they are counter-intuitive in economic terms. It may also be necessary to overcome limitations resulting from some relevant levels of collinearity between a set of independent variables, and to enlarge the sample with more sectors and firms. In this case, it is necessary that the market prices for bonds exist, otherwise the OAS cannot be computed.

We find evidence of the suggested highly dependency of the banking funding costs on sovereign risks variables and macroeconomic indicators – Public Debt to GDP ratio – as in Gerlach et al. (2010), which describes the spill-over effects between the State and the banking system.

This study raises some points to further development on specific industries in cross-country analysis, in order to compare the determinants of Portuguese corporate bond spreads with other European markets. This entails the need to change methodology from pooling regression towards panel data analysis, and to define different criteria to build samples. We are, nonetheless, aware of the limitations on liquidity, maturity spectrum and attractiveness of the Portuguese corporate bond market in comparison with the major European markets.

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## 6. APPENDIX

**Table A.1 Description of Excluded Independent Variables**

**Preliminary specification process of the multivariate linear regression**

| <b>Group Set</b>            | <b>Variable</b>                                     | <b>Description</b>  | <b>Unit of Measurement</b>           | <b>Data Source</b>                               |
|-----------------------------|---|---|--------------------------------------|--|
| 1. Firm specific            | EBITDA  | Earnings before income taxes depreciation and amortizations | Millions euro<br>(natural logarithm) | Financial Statements ,<br>firm sites and<br>CMVM |
| 2. Firm market value        | Price Stock   | Quarterly return on price stock                             | Percent                              |  |
| 4. Sovereign risk           | Euro 10YYield<br>ECB                                | 10 years ECB yield  | Percent (natural logarithm)          | ECB  |
| 5. Macroeconomic conditions | GDPGrowth   | Portuguese GDP Growth YoY                                   | Percent                              | INE and BoP                                      |
|                             | CPI Growth  | Portuguese CPI growth YoY (inflation)                       | Percent                              | INE  |
| 6. External factors         | Iboxx Euro<br>Aggregate<br>CorporateTotal<br>Return | Quarterly return of Iboxx index                             | Percent                              | Markit   |
|                             | Iboxx Euro<br>HighYield Total<br>Return             | Quarterly return of Iboxx index                             | Percent                              | Markit   |

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**Table A.2 Correlation Matrix of Explanatory Variables – Pearson**

| Explanatory variables |             | OAS     | SIZE    | Equity Debt | Debt Assets | EBITDA Assets | Debt EBITDA | Volatility | TimeToMaturity | TtM Debt Assets | Portuguese 10Y Yield | Debt GDP | Confidence Index | VSTOXX 12M |
|-----------------------|-------------|---------|---------|-------------|-------------|---------------|-------------|------------|----------------|-----------------|----------------------|----------|------------------|------------|
| OAS                   | Pearson     | 1       | -.043   | ,350**      | -.119**     | -.317**       | -.051       | ,681**     | -.188**        | -.227**         | ,715**               | ,768**   | -.149**          | ,628**     |
|                       | Sig. (2-t)  |         | ,246    | ,000        | ,001        | ,000          | ,166        | ,000       | ,000           | ,000            | ,000                 | ,000     | ,000             | ,000       |
| SIZE                  | Pearson     | -.043   | 1       | ,561**      | -.780**     | -.365**       | ,084*       | ,013       | -.011          | -.247**         | ,232**               | ,277**   | ,020             | ,154**     |
|                       | Sig. (2-t)  | ,246    |         | ,000        | ,000        | ,000          | ,021        | ,715       | ,757           | ,000            | ,000                 | ,000     | ,581             | ,000       |
| EquityDebt            | Pearson     | ,350**  | ,561**  | 1           | -.809**     | -.627**       | ,033        | ,311**     | -.227**        | -.520**         | ,442**               | ,504**   | ,070             | ,211**     |
|                       | Sig. (2-t)  | ,000    | ,000    |             | ,000        | ,000          | ,372        | ,000       | ,000           | ,000            | ,000                 | ,000     | ,055             | ,000       |
| DebtAssets            | Pearson     | -.119** | -.780** | -.809**     | 1           | ,538**        | -.047       | -.160**    | ,192**         | ,542**          | -.286**              | -.312**  | -.028            | -.108**    |
|                       | Sig. (2-t)  | ,001    | ,000    | ,000        |             | ,000          | ,199        | ,000       | ,000           | ,000            | ,000                 | ,000     | ,444             | ,003       |
| EBITDAAssets          | Pearson     | -.317** | -.365** | -.627**     | ,538**      | 1             | ,027        | -.468**    | ,335**         | ,527**          | -.368**              | -.441**  | -.014            | -.286**    |
|                       | Sig. (2-t)  | ,000    | ,000    | ,000        | ,000        |               | ,458        | ,000       | ,000           | ,000            | ,000                 | ,000     | ,701             | ,000       |
| DebtEBITDA            | Pearson     | -.051   | ,084*   | ,033        | -.047       | ,027          | 1           | -.048      | ,077*          | ,111**          | ,026                 | -.013    | ,006             | -.008      |
|                       | Sig. (2-t)  | ,166    | ,021    | ,372        | ,199        | ,458          |             | ,187       | ,036           | ,002            | ,482                 | ,720     | ,862             | ,832       |
| Volatility            | Pearson     | ,681**  | ,013    | ,311**      | -.160**     | -.468**       | -.048       | 1          | -.252**        | -.359**         | ,353**               | ,543**   | -.015            | ,726**     |
|                       | Sig. (2-t)  | ,000    | ,715    | ,000        | ,000        | ,000          | ,187        |            | ,000           | ,000            | ,000                 | ,000     | ,692             | ,000       |
| TimeToMaturity        | Pearson     | -.188** | -.011   | -.227**     | ,192**      | ,335**        | ,077*       | -.252**    | 1              | ,696**          | -.151**              | -.190**  | ,018             | -.137**    |
|                       | Sig. (2-t)  | ,000    | ,757    | ,000        | ,000        | ,000          | ,036        | ,000       |                | ,000            | ,000                 | ,000     | ,628             | ,000       |
| TtMDebtAssets         | Pearson     | -.227** | -.247** | -.520**     | ,542**      | ,527**        | ,111**      | -.359**    | ,696**         | 1               | -.259**              | -.294**  | ,002             | -.158**    |
|                       | Sig. (2-t)  | ,000    | ,000    | ,000        | ,000        | ,000          | ,002        | ,000       | ,000           |                 | ,000                 | ,000     | ,950             | ,000       |
| Portuguese10Y Yield   | Pearson     | ,715**  | ,232**  | ,442**      | -.286**     | -.368**       | ,026        | ,353**     | -.151**        | -.259**         | 1                    | ,817**   | -.194**          | ,340**     |
|                       | Sig. (2-t)  | ,000    | ,000    | ,000        | ,000        | ,000          | ,482        | ,000       | ,000           | ,000            |                      | ,000     | ,000             | ,000       |
|                       | Sig. (2-t)  | ,000    | ,000    | ,000        | ,000        | ,000          | ,966        | ,000       | ,000           | ,000            | ,000                 | 0,000    | ,218             | ,000       |
| DebtGDP               | Pearson     | ,768**  | ,277**  | ,504**      | -.312**     | -.441**       | -.013       | ,543**     | -.190**        | -.294**         | ,817**               | 1        | ,080*            | ,586**     |
|                       | Sig. (2-t)  | ,000    | ,000    | ,000        | ,000        | ,000          | ,720        | ,000       | ,000           | ,000            | ,000                 |          | ,030             | ,000       |
| Confidence Index      | Pearson     | -.149** | ,020    | ,070        | -.028       | -.014         | ,006        | -.015      | ,018           | ,002            | -.194**              | ,080*    | 1                | -.197**    |
|                       | Sig. (2-t)  | ,000    | ,581    | ,055        | ,444        | ,701          | ,862        | ,692       | ,628           | ,950            | ,000                 | ,030     |                  | ,000       |
| VSTOXX12M             | Pearson     | ,628**  | ,154**  | ,211**      | -.108**     | -.286**       | -.008       | ,726**     | -.137**        | -.158**         | ,340**               | ,586**   | -.197**          | 1          |
|                       | Sig. (2-ta) | ,000    | ,000    | ,000        | ,003        | ,000          | ,832        | ,000       | ,000           | ,000            | ,000                 | ,000     | ,000             |            |

**Table A.3. Correlation Matrix of Explanatory Variables - Spearman**

| Explanatory Variables<br>Spearman's rho |             | OAS     | SIZE    | Equity<br>Debt | Debt<br>Assets | EBITD<br>AAssets | Debt<br>EBITDA | Volatility | TimeTo<br>Maturity | TtM Debt<br>Assets | Portuguese<br>10Y Yield | Debt<br>GDP | Confidence<br>Index | VSTOXX<br>X12M |
|---|-------------|---------|---------|----------------|----------------|------------------|----------------|------------|--------------------|--------------------|-------------------------|-------------|---------------------|----------------|
| OAS                                     | Correlation | 1,000   | ,196**  | ,250**         | -,249**        | -,363**          | -,019          | ,649**     | -,265**            | -,292**            | ,716**                  | ,780**      | -,184**             | ,632**         |
|   | Sig. (2-t)  |         | ,000    | ,000           | ,000           | ,000             | ,613           | ,000       | ,000               | ,000               | ,000                    | ,000        | ,000                | ,000           |
| SIZE                                    | Correlation | ,196**  | 1,000   | ,756**         | -,795**        | -,684**          | ,153**         | ,363**     | -,213**            | -,529**            | ,324**                  | ,417**      | ,023                | ,292**         |
|   | Sig. (2-t)  | ,000    |         | ,000           | ,000           | ,000             | ,000           | ,000       | ,000               | ,000               | ,000                    | ,000        | ,537                | ,000           |
| EquityDebt                              | Correlation | ,250**  | ,756**  | 1,000          | -,881**        | -,651**          | ,025           | ,247**     | -,301**            | -,621**            | ,322**                  | ,398**      | ,075*               | ,121**         |
|   | Sig. (2-t)  | ,000    | ,000    |                | ,000           | ,000             | ,502           | ,000       | ,000               | ,000               | ,000                    | ,000        | ,040                | ,001           |
| DebtAssets                              | Correlation | -,249** | -,795** | -,881**        | 1,000          | ,643**           | ,149**         | -,295**    | ,286**             | ,645**             | -,307**                 | -,392**     | -,047               | -,155**        |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           |                | ,000             | ,000           | ,000       | ,000               | ,000               | ,000                    | ,000        | ,203                | ,000           |
| EBITDAAssets                            | Correlation | -,363** | -,684** | -,651**        | ,643**         | 1,000            | -,389**        | -,530**    | ,363**             | ,583**             | -,335**                 | -,465**     | -,006               | -,351**        |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           |                  | ,000           | ,000       | ,000               | ,000               | ,000                    | ,000        | ,879                | ,000           |
| DebtEBITDA                              | Correlation | -,019   | ,153**  | ,025           | ,149**         | -,389**          | 1,000          | ,177**     | ,009               | ,088*              | ,034                    | ,069        | -,065               | ,153**         |
|   | Sig. (2-t)  | ,613    | ,000    | ,502           | ,000           | ,000             |                | ,000       | ,796               | ,016               | ,356                    | ,061        | ,076                | ,000           |
| Volatility                              | Correlation | ,649**  | ,363**  | ,247**         | -,295**        | -,530**          | ,177**         | 1,000      | -,278**            | -,362**            | ,332**                  | ,516**      | -,071               | ,747**         |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           | ,000             | ,000           |            | ,000               | ,000               | ,000                    | ,000        | ,051                | ,000           |
| TimeTo<br>Maturity                      | Correlation | -,265** | -,213** | -,301**        | ,286**         | ,363**           | ,009           | -,278**    | 1,000              | ,837**             | -,197**                 | -,252**     | ,026                | -,186**        |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           | ,000             | ,796           | ,000       |                    | ,000               | ,000                    | ,000        | ,485                | ,000           |
| TtMDebtAssets                           | Correlation | -,292** | -,529** | -,621**        | ,645**         | ,583**           | ,088*          | -,362**    | ,837**             | 1,000              | -,283**                 | -,346**     | ,007                | -,210**        |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           | ,000             | ,016           | ,000       | ,000               |                    | ,000                    | ,000        | ,849                | ,000           |
| Portuguese10Y<br>Yield                  | Correlation | ,716**  | ,324**  | ,322**         | -,307**        | -,335**          | ,034           | ,332**     | -,197**            | -,283**            | 1,000                   | ,790**      | -,248**             | ,441**         |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           | ,000             | ,356           | ,000       | ,000               | ,000               |                         | ,000        | ,000                | ,000           |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           | ,000             | ,033           | ,000       | ,000               | ,000               |                         | ,000        | 0,000               | ,005           |
| DebtGDP                                 | Correlation | ,780**  | ,417**  | ,398**         | -,392**        | -,465**          | ,069           | ,516**     | -,252**            | -,346**            | ,790**                  | 1,000       | -,003               | ,600**         |
|   | Sig. (2-t)  | ,000    | ,000    | ,000           | ,000           | ,000             | ,061           | ,000       | ,000               | ,000               | ,000                    |             | ,933                | ,000           |
| Confidence<br>Index                     | Correlation | -,184** | ,023    | ,075*          | -,047          | -,006            | -,065          | -,071      | ,026               | ,007               | -,248**                 | -,003       | 1,000               | -,138**        |
|   | Sig. (2-t)  | ,000    | ,537    | ,040           | ,203           | ,879             | ,076           | ,051       | ,485               | ,849               | ,000                    | ,933        |                     | ,000           |
| VSTOXX12M                               | Correlation | ,632**  | ,292**  | ,121**         | -,155**        | -,351**          | ,153**         | ,747**     | -,186**            | -,210**            | ,441**                  | ,600**      | -,138**             | 1,000          |
|   | Sig. (2-t)  | ,000    | ,000    | ,001           | ,000           | ,000             | ,000           | ,000       | ,000               | ,000               | ,000                    | ,000        | ,000                |                |

\*\* . Correlation is significant at the 0.01 level (2-tailed).

\* . Correlation is significant at the 0.05 level (2-tailed).

**Table A. 4. Bond Issues Included in the sample – ISINs and Sector.**

| Sector                                      | Firm Name         | Bond ISIN    | Sector                    | Firm Name    | Bond ISIN    |
|---|-------------------|--------------|---------------------------|--------------|--------------|
| <b>0. Building Materials &amp; Fixtures</b> | CIMPOR            | XS0192377538 | <b>5. Banking (Cont.)</b> | BCP          | PTBCPVXE0000 |
|   |                   |              |                           | BCP          | PTBCSKOM0019 |
| <b>1. Transportation Services</b>           | BRISA             | PTBRIHOM0001 | BCP                       | PTBCSSOE0011 |              |
|   | BRISA             | PTSSAOM0005  | BCP                       | PTBCU31E0002 |              |
|   | BRISA             | XS0140610881 | BCP                       | PTBCUB1E0005 |              |
|   | BRISA             | XS0177256889 | BCP                       | PTBCVU1E0003 |              |
| <b>2. Recreational Services</b>             | BENFICA           | PTSLBBOE0001 | BCP                       | XS0125215458 |              |
|   |                   |              | BES                       | PTBEMB1E0016 |              |
|   |                   |              | BES                       | PTBEMPOE0018 |              |
|   |                   |              | BES                       | PTBEMYXE0008 |              |
| <b>3. Telecommunications</b>                | PTELECOM          | XS0096141337 | BES                       | PTBERJOM0011 |              |
|   |                   |              | BES                       | PTBERU1E0015 |              |
|   |                   |              | BES                       | PTBLMFOM0003 |              |
|   |                   |              | BES                       | PTBLMGOM0002 |              |
|   |                   |              | BES                       | PTBLMHOM0001 |              |
|   |                   |              | BES                       | PTBLMKOE0006 |              |
|   |                   |              | BES                       | PTBLMLOE0005 |              |
|   |                   |              | BES                       | PTBLMMOE0004 |              |
|   |                   |              | BES                       | PTBLMNOE0003 |              |
|   |                   |              | BES                       | PTBLMOOE0002 |              |
| <b>4. Conventional Electricity</b>          | EDP               | XS0103383286 | BES                       | PTBLMPOE0001 |              |
|   | EDP               | XS0126990778 | BES                       | PTBLMQOE0000 |              |
|   | EDP               | XS0139081763 | BES                       | PTBLMROE0009 |              |
|   | EDP               | XS0159585453 | BES                       | PTBLMSOE0008 |              |
|   | EDP               | XS0221295628 | BES                       | PTBLMTOE0007 |              |
|   | EDP               | XS0223447227 | BES                       | PTBLMVOE0011 |              |
|   | EDP               | XS0256996538 | BES                       | PTBLMXOM0019 |              |
|   | EDP               | XS0256997007 | BES                       | PTESSJOM0011 |              |
|   | EDP               | XS0413462721 | BES                       | PTESSLOM0017 |              |
|   | EDP               | XS0435879605 | BES                       | XS0124637405 |              |
|   | EDP               | XS0495010133 | BES                       | XS0128883922 |              |
|   | EDP               | XS0586598350 | BES                       | XS0128963526 |              |
|   | REN               | PTRELAOM0000 | BES                       | XS0129481668 |              |
|   | REN               | PTRELBOM0009 | BES                       | XS0129882493 |              |
|   | <b>5. Banking</b> | BANIF        | PTBAFPOE0003              | BES          | XS0130374779 |
|   |                   | BCP          | PTBCLQOM0010              | BES          | XS0132404186 |
| BCP   |                   | PTBCLSOE0018 | BES                       | XS0132472266 |              |
| BCP   |                   | PTBCLYOM0010 | BES                       | XS0132563577 |              |
| BCP   |                   | PTBCP9OM0051 | BES                       | XS0138932842 |              |

## Determinants of Corporate Risk using Option-Adjusted Spreads: The case of Portugal

| Sector            | Firm Name | Bond ISIN    | Sector | Firm Name | Bond ISIN    |
|-------------------|-----------|--------------|--------|-----------|--------------|
| 5. Banking (Cont) | BES       | XS0139270143 | BPI    |           | PTBBQEOM0028 |
|                   | BES       | XS0144570628 | BPI    |           | PTBBQO1E0024 |
|                   | BES       | XS0174467463 | BPI    |           | PTBBSQXE0005 |
|                   | BPI       | PTBB0ROM0005 | BPI    |           | PTBBSRXE0004 |
|                   | BPI       | PTBB21OM0003 | BPI    |           | PTBBSXOM0023 |
|                   | BPI       | PTBB24OE0000 | BPI    |           | PTBBTOOM0015 |
|                   | BPI       | PTBB2GOM0006 | BPI    |           | PTBBY8OM0015 |
|                   | BPI       | PTBB3BOM0000 | BPI    |           | PTBBYOOM0018 |
|                   | BPI       | PTBB5JOE0000 | BPI    |           | PTBIS7OM0005 |

Figure A. 1– Scatter Plot OAS and Independent Variables – StataIC

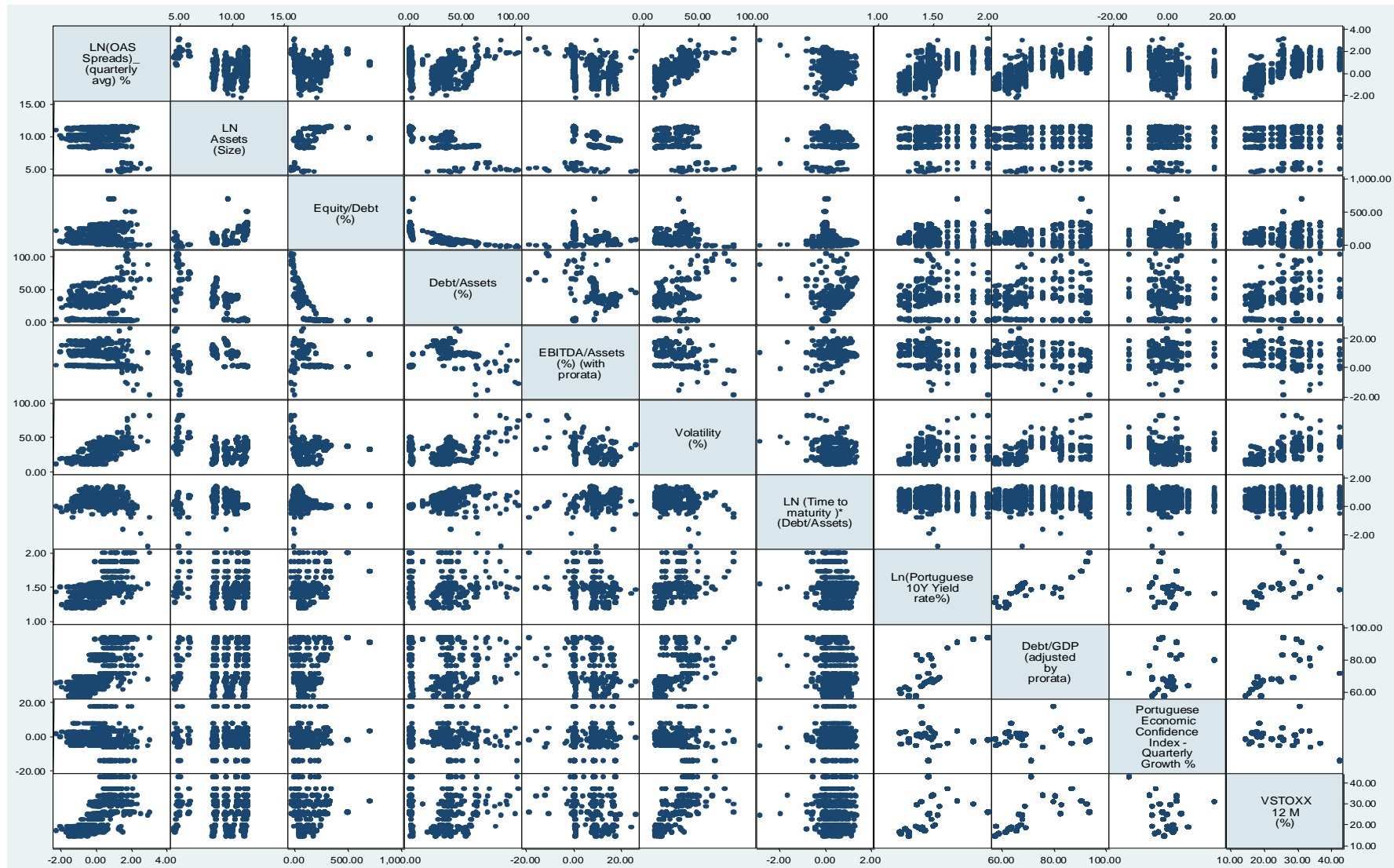


Figure A. 2 - -OAS Time Series per Sector - Charts

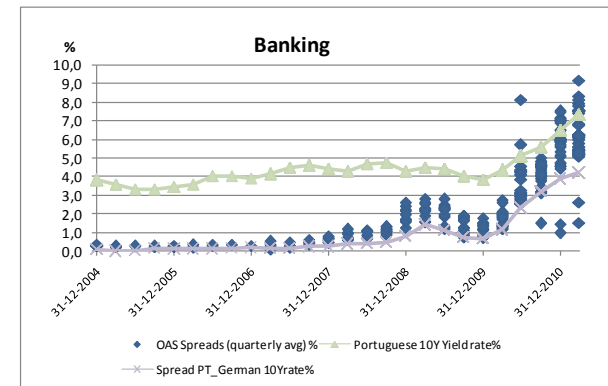
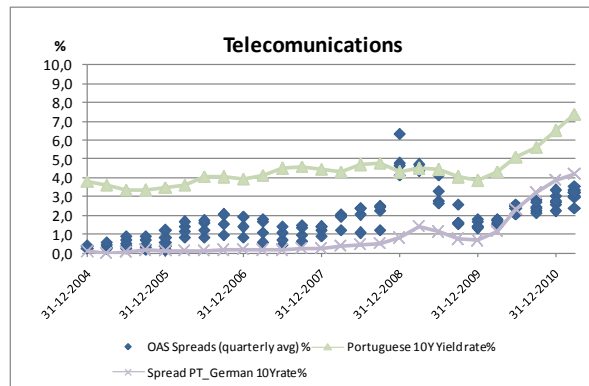
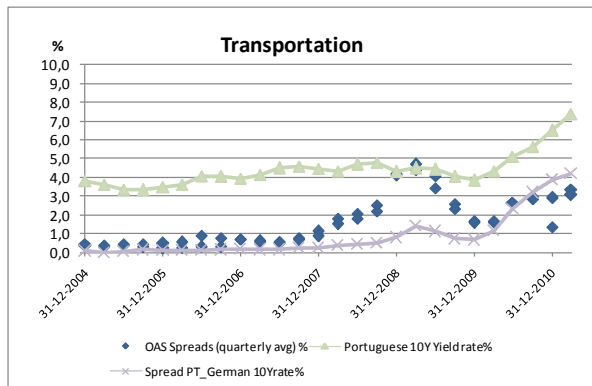
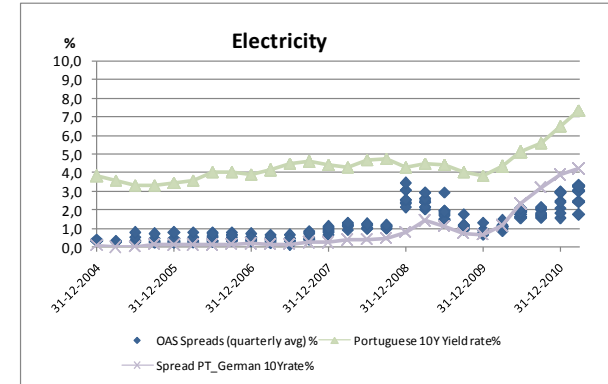
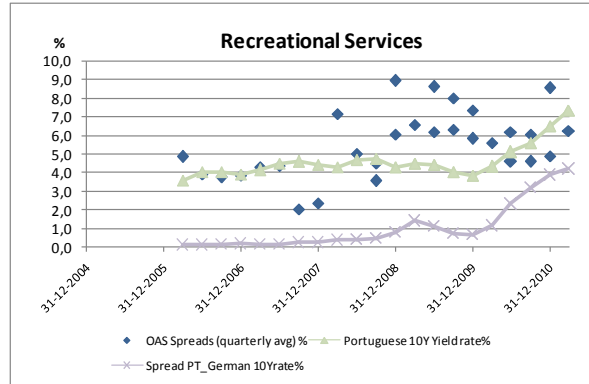
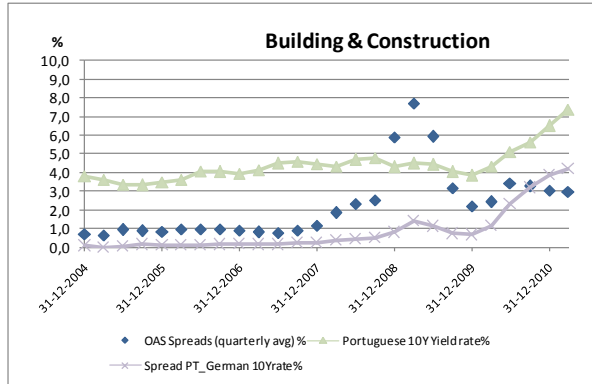
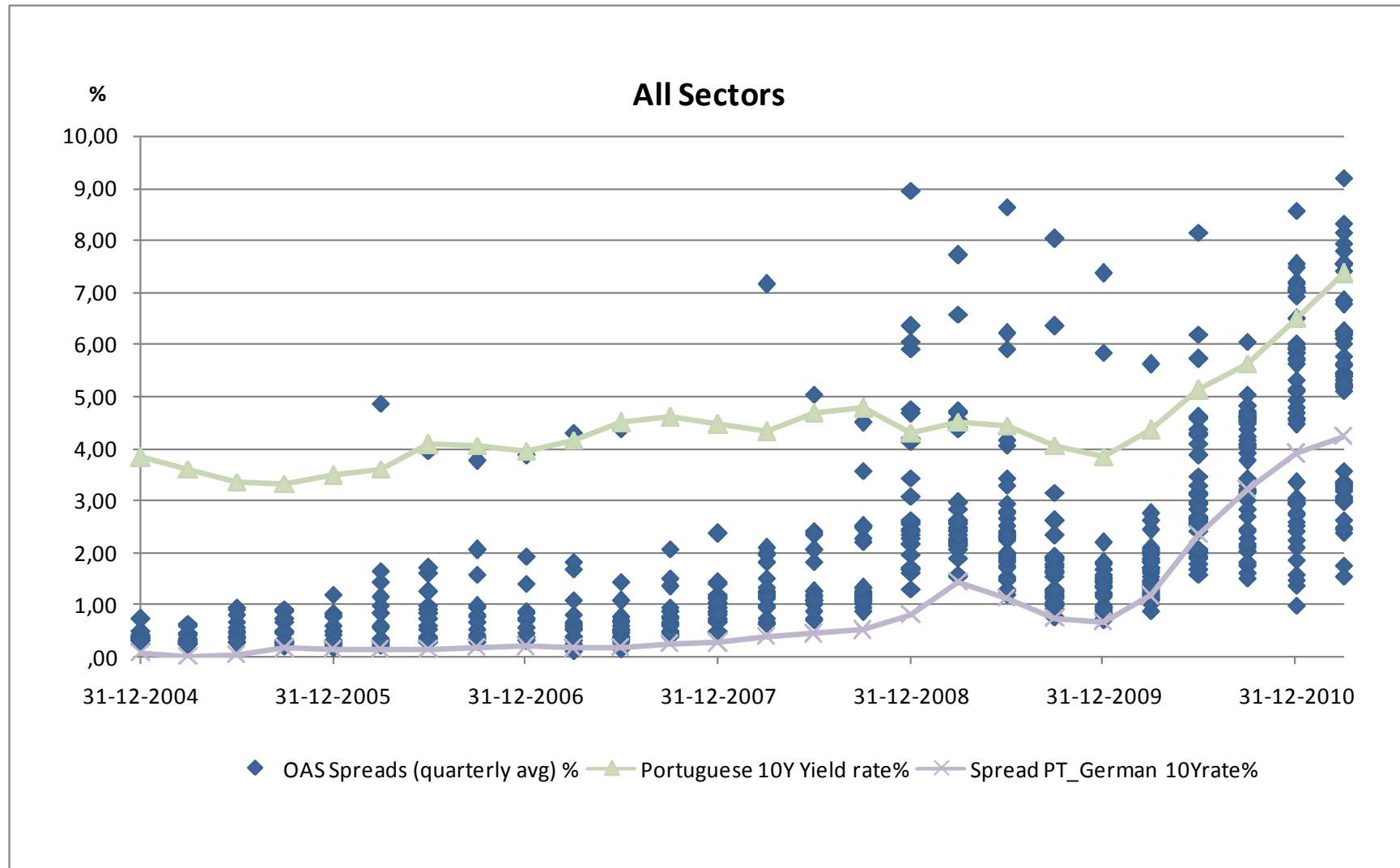
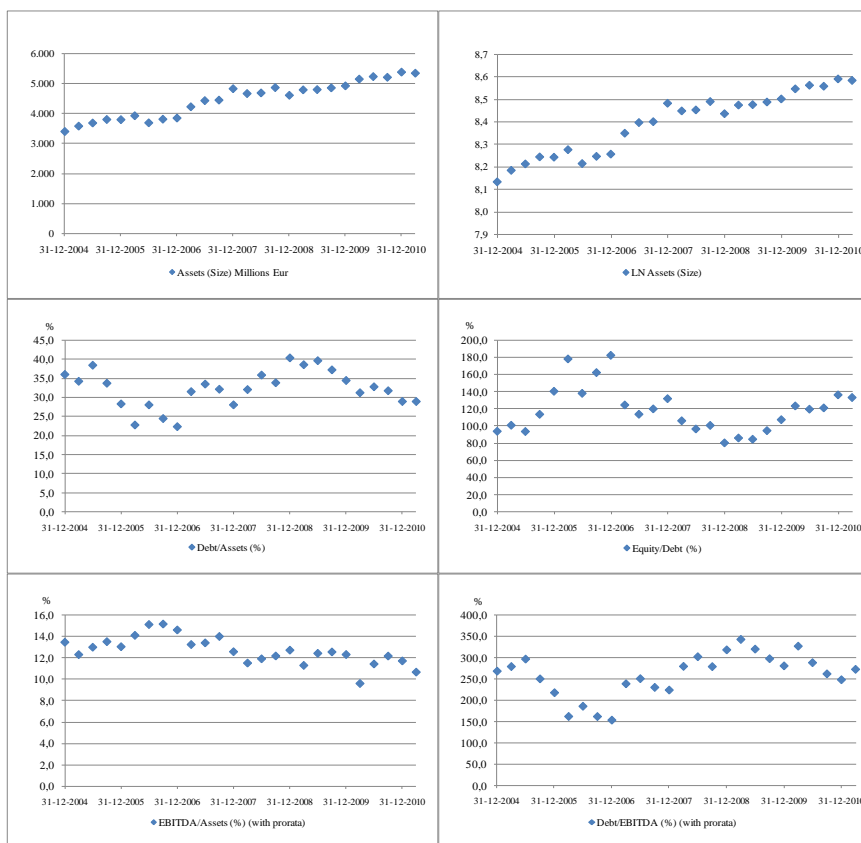


Figure A. 3 – OAS Time Series - All Sectors

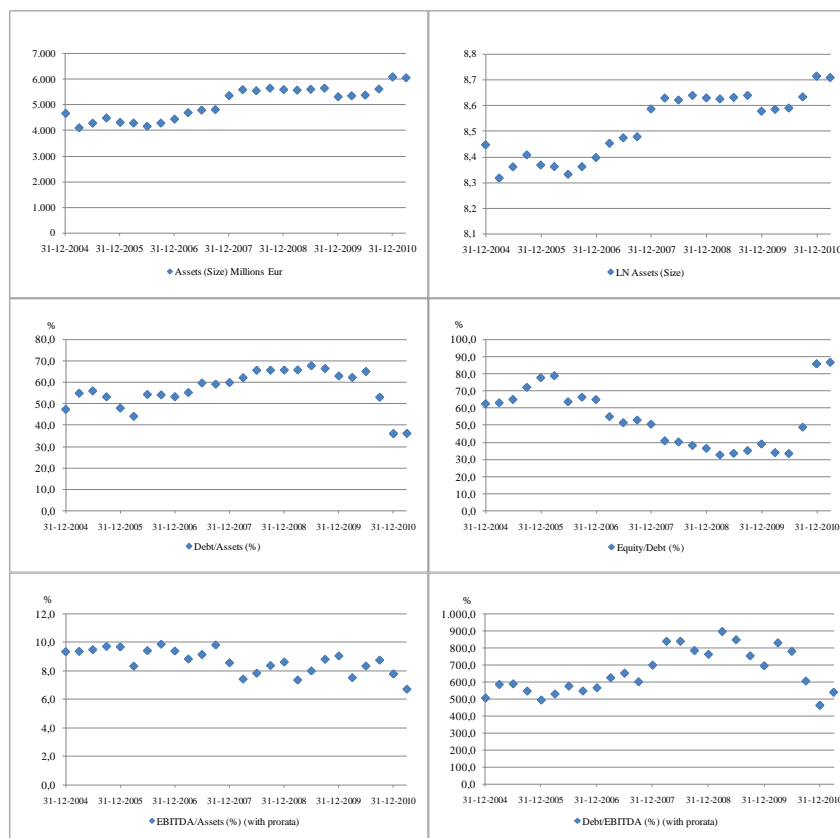




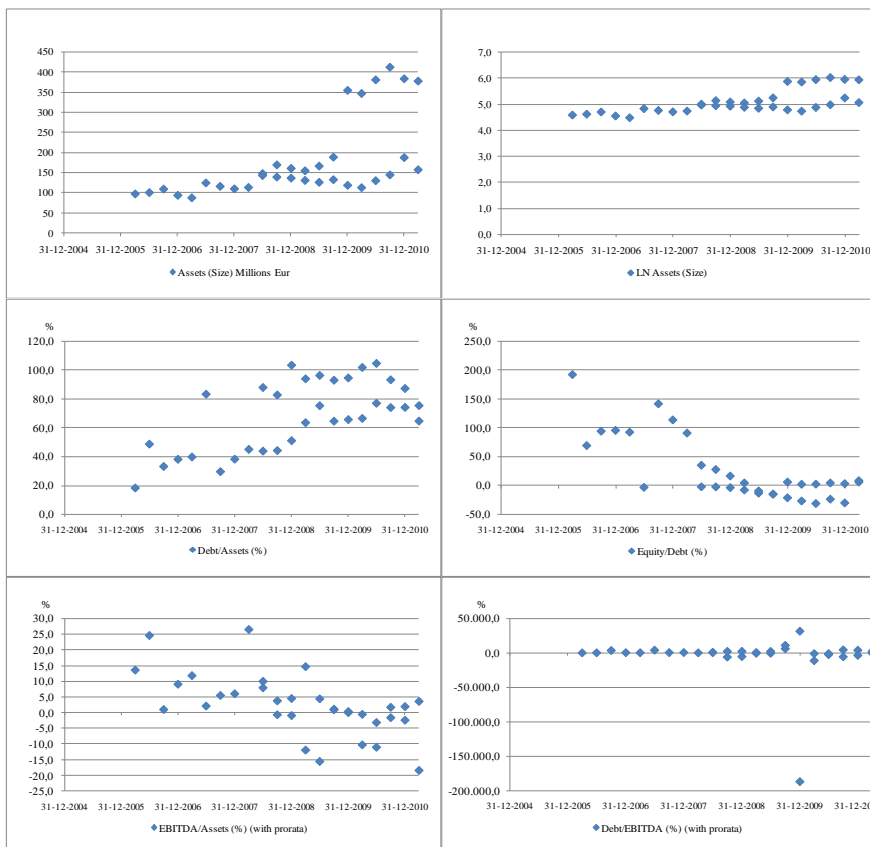
**Figure A. 4 – Firm-Specific Variables - Building Materials & Fixtures (1 company)**



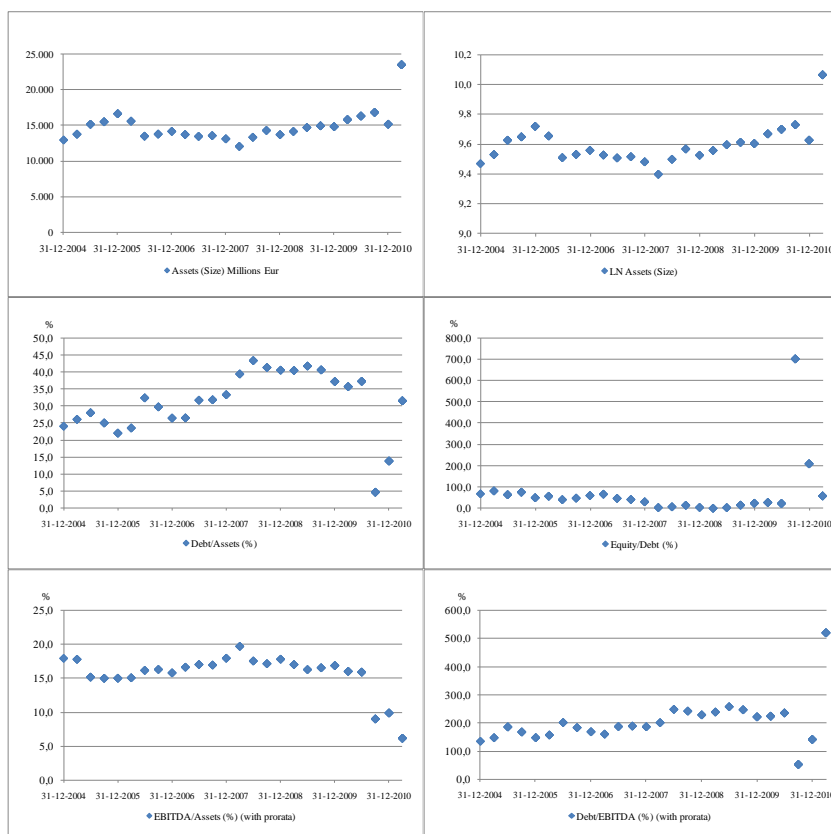
**Figure A. 5 – Firm-Specific Variables - Transportation Services (1 company)**



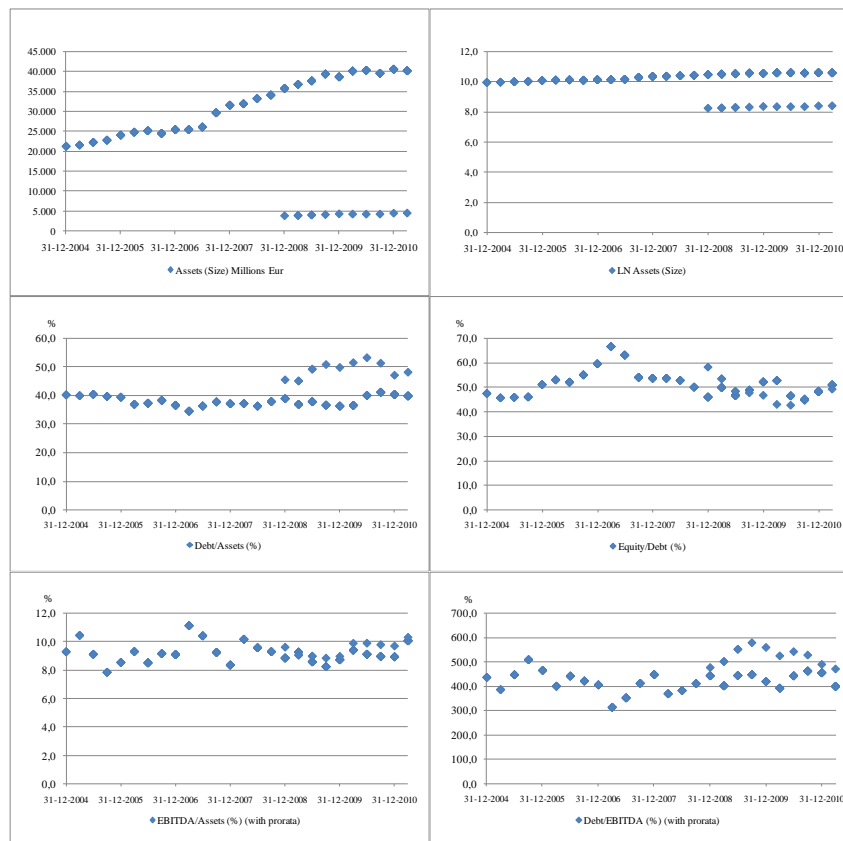
**Figure A. 6 – Firm-Specific Variables - Recreational Services (2 companies)**



**Figure A. 7 – Firm-Specific Variables - Telecommunications (1 company)**



**Figure A. 8 – Firm-Specific Variables - Conventional Electricity (2 companies)**



**Figure A. 9 – Firm-Specific Variables - Banking (4 local banks)**

