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# The effectiveness of the auditor's going concern evaluation as an external governance mechanism: Evidence from loan defaults<sup>\*</sup>

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#### Abstract

When there is substantial doubt about an entity's ability to continue as a going concern, professional auditing standards require the independent auditor to disclose the uncertainty in the auditor's opinion. This study assesses the influence of the independent auditor's going concern evaluation by examining default following the release of the auditor's report. We use a proprietary sample maintained by the Portuguese central bank on 12,199 audit reports relating to approximately 2,000 firms that are liable by law to have their accounts audited on an annual basis. Empirical estimation of a logit model controlling for accounting cash flow related and non-accounting variables shows that the likelihood of default for firms that received going concern opinion is 2.792 times that of firms that received a clean opinion. Likelihood ratio tests for omitted variable also confirm the incremental predictive ability of going concern opinion over and above accounting and non-accounting variables for the estimation and hold-out samples. In the non-defaulting group the average default rate is 6.05% and in the defaulting group it is 17.78%. The default rate for firms in the non-defaulting group that received a going concern opinion is 9.92% and for firms that received a clean opinion is 5.96%. In the defaulting group, the rate for firms that received a going concern opinion is 35.49% and for firms that received a clean opinion is 16.96%. Checks for robustness across different asset classes, age, industries and regions indicate that firms that receive a going concern opinion on average default more than those that receive a clean opinion.

#### JEL classification: M42; G33; G21.

Keywords: Auditing; Bankruptcy and liquidation; Bank loans.

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#### The effectiveness of the auditor's going concern evaluation as an external governance mechanism: Evidence from loan defaults

#### **1. Introduction**

Independent auditors that have a substantial doubt about the ability of a company to continue to meet its obligations are required to disclose this uncertainty in their opinion.<sup>1</sup> Although there has been apparent public support for the requirement to disclose going concern uncertainties in the independent audit report, there is some opposition to this on the contention that the auditor's evaluation of uncertainties is not superior to evaluations which statement users could make (Brown, 1989). However, the audit opinion may provide useful information because the independent auditor has intimate knowledge of the client's activities and future plans (Mutchler, 1985; Menon and Schwart, 1987). The results of surveys and experiments reported in the accounting literature support the claim that statement users find the auditor's going concern disclosures valuable (Firth, 1979; Campbell and Mutchler, 1988). Recent research also recognizes the effectiveness of the auditor's going concern opinion as an external governance mechanism (Willenborg and McKeown, 2000; Fan and Wong, 2005).

Despite the importance of going concern problems and the controversy surrounding the independent auditor's disclosure, research concerning the incremental value to market reaction to the going concern opinion is limited. Firth (1978) shows that financial markets react negatively to going concern uncertainties. Elliott (1982) and Dodd et al. (1984) find negative abnormal returns during the period surrounding the release of the auditor's going concern opinion, but their results were not significant at statistically meaningful levels. Loudder et al. (1992) find that the market reaction to subject-to qualifications depended on the probability that the independent auditor would issue a qualified opinion. They provide separate statistics for clean and going concern opinions. Jones (1996) provides evidence on the incremental value of the going concern disclosures in the audit report to investors in financially distressed firms. He shows that mean

<sup>&</sup>lt;sup>1</sup> The need for such a disclosure was recognized early on by certified public accountant bodies (for example, the SAS No. 2 issued by the AICPA -American Institute of Certified Public Accountants - in 1974). Professional accounting standards in many countries provide important guidelines for the disclosure of going concern problems (for example, the SAS No. 34 and SAS No. 59 issued by AICPA in 1981 and 1988). The requirement to disclose going concern uncertainties has been controversial in many countries. In 1982, for example, the AICPA proposed to eliminate the requirement. Strong public opposition frustrated this effort (Mann 1982). Public interest in the matter continued into the mid-1980s because situations were observed in which firms had gone bankrupt without any alert about going concern problems in their reports (Berton and Ingersoll, 1985). The AICPA responded to this by issuing standards, including SAS No. 59, which increased the responsibility of auditors in evaluating and disclosing going concern problems. In the SAS No. 34, independent auditors were not required to search for evidence relating to continued existence. But, if during auditing, certain information raised uncertainty about the ability of firms continuing to operate, auditors were required to evaluate firm status and disclose doubts about continuity of operations. In the SAS No. 59, independent auditors are required to actively assess the going concern status of their clients.

abnormal returns surrounding the release of the auditors' reports were lower for going concern opinions than for clean opinions. Hopwood et al. (1989), McKee (2003) and Geiger et al. (2005) found that the independent audit opinion had incremental value in models used to predict client bankruptcies. However, to date, there is no evidence on the influence of auditor's opinion and its incremental value in contemporary models used to predict default.

Our paper analyzes the likelihood of default for firms that received a going concern opinion (GCO) and for firms that received a clean opinion (CO). We recognize that a clean opinion (CO) - an unqualified opinion - can be viewed as a favorable evaluation of going concern status. Our study includes a sample of over 12,000 audit opinions maintained by the central bank in Portugal, a sample that is larger than any previously reported study.<sup>2</sup> Portuguese business law imposes corporate firms to certify their accounts with a certified auditor (*Revisor Oficial de Contas- ROC*). Where the auditor has doubts about a firm's ability to continue as a going concern, the professional code of conduct requires the independent auditor to disclose the uncertainty in her or his opinion. According to the rules of the chamber of *ROC*, independent auditors are required to proactively assess the going concern status of a client and issue a GCO opinion. The history of going concern uncertainty in Portugal has also been controversial along the lines described in the introduction but from the year 2000 onwards, the chamber of *ROC* recommends the adoption of the International Standard of Auditing 570.

In this paper, we first model the influence of GCO on default. This influence is analyzed within the context of a standard model used to monitor financial pressure in the corporate sector at the central bank. We then assess the incremental predictive ability of GCO over and above other accounting and non-accounting factors. We then compute expected default rates for both GCO and CO firms. In the next section we develop the hypotheses, section 3 describes the data and method used to test the hypotheses, section 4 reports the findings, and the final section provides a summary and conclusion.

#### 2. Hypotheses and variables

#### Going concern opinion

There are good reasons to believe that independent auditors' disclosures about going concern status are useful because these disclosures are based on extensive access to information

<sup>&</sup>lt;sup>2</sup> The value of non-US data is recognized by Ferguson et al. (2003), Fan and Wong (2005) and Khanna et al. (2004).

and managers. Professional accounting standards suggest that in assessing going concern status, independent auditors should consider labor problems, excessive reliance on a few customers, and mitigating factors such as the company's ability to cut costs, sell assets, and obtain additional credit. Some of this information, acquired by the independent auditor, may not be publicly available to investors and analysts. The independent auditor's evaluation about the going concern status of a particular firm can be indicated explicitly by a comment in the independent auditor's report, or may be indicated implicitly by a clean opinion which makes no reference to going concern uncertainties. If there is information content in the independent auditor's evaluation, one would expect a positive relation to default in light of the issuance of the GCO. A GCO is a remark made by a certified auditor that appears coupled to the annual company accounts. It does not explicitly suggest that the firm is about to default. However, it can point towards the firm's inability to meet its debt obligations, reflecting information which is 'not clean' about firms' activities thus transmitting a warning signal to creditors.

#### H1a: There is a positive relationship between a going concern opinion and default.

In the context of this paper, one issue is to determine whether, in practice, the independent auditor's going concern evaluation influences default is to examine the odds of default after the release of the GCO. A second issue is whether GCO has incremental predictive ability over and above established accounting and non-accounting information already used by investors and creditors. If the inclusion of GCO in a standard model of default shows statistical incremental ability in predicting default then one can conclude that it conveys information over and above other observable information.

H1b: Auditor's going concern opinion has incremental predictive ability over and above the other accounting and non-accounting information.

#### Accounting controls

Although there has been extensive scholarly research on default and these studies have effectively posed and confirmed relevant propositions, one important problem remains: there is still no agreement on what accounting factors are good predictors of default and why. In general though, most studies include at least some measure of cash flow, earnings, debt, and liquidity for short and long term horizon (Dambolena and Khoury, 1980). We use predictors used by Beaver (1966), Ohlson (1980) and Dimitras et al. (1996). The theoretical concept of default is simple but the implications for the empirical content of prediction models are not clear. Pioneering research

work on default makes the assumption that default occurs whenever realized operational profits or realized plus expected operational profits are less than debt obligations. This perspective indicates that if current operating profits accurately predict future financial status, then past and present operational profit measure in terms of the level of debt obligations should be good predictors of default (Scott, 1981). Empirical studies that predict corporate failure generally include theoretically determined cash flow variables in their models (Casey and Bartczak, 1985; Gentry et al., 1985; Aziz et al., 1988).

#### H2a: There is a negative relationship between a cash flow to debt and default.

The more profitable the firm, the greater its capacity to raise capital on attractive terms. Firms that that do not generate positive earnings will be more constrained in raising external capital to finance their projects. It is thus desirable to generate positive earnings before interest and tax on a regular basis to meet debt obligations. The ratio of earnings before interest and tax divided by financial costs (FINANCOV) indicates the elbowroom in debt servicing in the long run (Laitinen, 1994; Laitinen and Kankaanpää, 1999).

#### H2b: There is a negative relationship between a financial coverage and default.

To meet debt obligations in the short-run, firms have to dispose current assets. Firms' short-term liquidity measured as ratio of current assets to current liabilities (LIQUIDITY) indicates their ability to transform current assets into cash that can be used to meet immediate obligations. The greater the ability to transform current assets into cash the larger the capacity to settle obligations (Dambolena and Khoury, 1980).

#### H2c: There is a negative relationship between liquidity and default.

The level of capital is relevant since it is related not only to the level of debt, but also to the capacity of the firm to absorb losses. A high solvency ratio, measured through equity as a ratio of total assets (SOLIDITY) indicates the ability of the firm to finance assets with own equity reducing the dependence on external finance. Thus a high solvency ratio should decrease the probability of a firm entering into default (Westgaard and Wijst, 2001).

H2d: There is a negative relationship between solvability and default. Non-accounting controls

A large number of models developed to predict default use annual accounting information in the form of financial ratios in order to predict default (or failure), mainly because these are objective measures based on publicly available information. Nevertheless, the use of financial ratios has been criticized and there are some drawbacks to default prediction on the basis of only accounting information. Models constructed on the basis of financial ratios implicitly assume that annual accounts give a fair and true view of firms' financial situation. However, many annual accounts are unreliable and do not give a fair and true view of the firms' financial situation. There is evidence that firms in general, and especially ones moving towards default, have incentives to manage their earnings and manipulate their annual accounts with creative accounting practices. Annual accounts close to the point of default are potentially likely to be unreliable and may result in a distorted model. However, this problem may be solved by using the previous years' annual accounts, which we do undertake in this study. Due to these criticisms some authors include non-accounting or qualitative indicators in default prediction models (Ohlson, 1980; Zavgren, 1983; Sheppard, 1994; Becchetti and Sierra, 2002). Examples of possible non-accounting and qualitative indicators used in these studies are size and age of the firm. These two factors are assumed to capture, indirectly, some of the distributional properties of the cash flow. Both size and age are associated with safer cash flows. Compared to small and young firms, large and older firms have more bargaining power in debt restructuring. Large (measure in millions of euros) and older firms (measure in years of existence) also have more managerial resources making these firms less susceptible to idiosyncratic shocks (Bickerdyke et al., 2000).

H3a: There is a negative relationship between firm size and default.
H3b: There is a negative relationship between age and default.
Industry and region controls

Our main hypothesis relating to GCO is controlled not only for accounting and nonaccounting influences but also for specific effects associated with industries (PRIMARY, MANUFACTURING, CONSTRUCTION, TRADE, HOSPITALITY, TRANSPORT AND COMMUNICATION and OTHERS) and regions (NORTH, LISBON, CENTRE, ALENTEJO, ALGARVE, AZORES, MADEIRA). Industry dummies are used to capture different capital intensity whereas regions are used to capture different costs of monitoring business activity (see Petersen and Rajan, 2002). The Nomenclature of Territorial Units for Statistics (NUTS) is a standard geographical code for referencing the administrative division of countries for statistical purposes. The standard is proposed by the European Union. Because of the nature of these dummy variables no hypotheses as to their influence was formulated. The developed hypotheses are tested as a function of a binary dependence on whether a firm defaulted (1) or not (0) following the issuance of a GCO.

#### 3. Data and method

We use a comprehensive data set for public corporations that are liable to have their accounts audited on an annual basis and maintained by the Central Bank of Portugal. The sample comprises 12,199 opinions on approximately 2,000 firms during the period 1997-2003. Almost 800 of these observations relate to firms that entered into default, representing 7% of the total. The Central Bank maintains data on approximately 16,000 firms. Firms that do not have to comply with certifying their accounts were not considered for this study. All the accounts reported up to a default are defined as accounts from a solvent firm. Only the last account of a defaulted firm is classified as a default account. The description of each firm was organized so as to generate consistent information for all firms. This yielded the date of set up, the size in millions of euros, industry code and geographic location.

The data contains annual information on credits granted by financial institutions to the corporate sector and includes an item that indicates the credit status of each loan (that is used in this study to define a loan as defaulted or non-defaulted). Loans are considered defaulted if classified (credit status) by the credit institutions with more than 90 days in arrears or when, for several reasons, are considered as doubtful despite performing, because the debt balance remains unpaid. This definition is recommended by the Basel Committee on Banking Supervision (2005). The definition includes those situations in which obligators (are past due more than 90 days on) have exceeded any of their credit obligations, or those in which, borrowers can be considered highly unlikely to meet their debts. In this way, the study defines a firm as defaulted at time "t" when any exposure (amount of debt outstanding) in the central credit register to that firm at time "t" is in default.

We removed firms with zero assets; negative sales and negative gross value-added (sum of net profit, depreciation, provisions, interest paid, taxes and salaries); short-term debt less than zero; total exposure lower than €100,000; solvency ratio larger than 100 per cent; those owned by general government or with legal form other than public (because these firms are not obliged to have their annual accounts audited). We also identified extreme observations. Some variables were transformed into logarithms and some observations were deleted (outlier and missing value

deletion) in order to comply with normality assumptions. We also considered alternative thresholds as at least 2% and 5% of the total exposure to test the definition of default, not taking residual events into account. Specifically, if the unpaid amount is less than 2% of the total credit drawn down, it is not considered to be unpaid. To improve the predictability of default, the study relates accounting data for year before "t-1" to the credit status of the firm in year "t".

The total contents of the database are illustrated in Table 1. It can be observed that the number of GCOs decreases along the years 1997-2003. The number of defaults on the other hand shows erratic behavior. The time frame is still considered to be small for investigating the effects of macroeconomic factors on default rates. As suggested by Fan & Wong (2005) and others, the market effect of audit opinions may depend on the perceived credibility of the auditors who issue the opinions. Therefore it might be meaningful to include the audit firm type (e.g., Big 5 or non-Big 5) in the model to control for the incremental information of audit firm credibility. Unfortunately we do not have a means of distinguishing Big 5 and non-Big 5 firms. Future research should certainly address this issue.

## INSERT TABLE 1 ABOUT HERE

The distribution of defaults by industry breakdown is displayed in Table 2. As the table shows, there are some significant differences in default frequencies across the industries. MANUFACTURING shows the largest number of defaults followed by TRADE and CONSTRUCTION. The distribution of defaults by geographic breakdown is displayed in Table 3. Defaults are mostly concentrated in the NORTH, CENTER and LISBON.

#### **INSERT TABLE 2 AND 3 ABOUT HERE**

The distribution of GCOs in the sample by industry breakdown in Table 4 shows that firms in MANUFACTURING, TRADE and OTHER sectors received the largest number of GCOs. The breakdown by geographical regions in Table 5 shows that firms in the NORTH, CENTER and LISBON received the largest number of GCOs.

#### **INSERT TABLE 4 AND 5 ABOUT HERE**

Differences between defaulting and non-defaulting firms for 1997-2002, broken down by default variable in 1998-2003, can be read from Table 6. The average for GCO in the non-defaulting group is less than the average for the defaulting group. Insofar as accounting variables

are concerned, the non-default group shows higher ratios for all variables. Surprisingly the nondefault group shows lower age. The proportion of firms in the defaulting group in MANUFACTURING is higher than the non-defaulting group. The situation is the opposite in TRADE and OTHER sectors. In terms of regions the proportion is fairly similar.

## INSERT TABLE 6 ABOUT HERE

Our objective is to empirically examine the hypotheses formulated in section 2. We thus specify an empirical model on the basis of those hypotheses, estimate the model's coefficients and test whether the sign and significance of the coefficients result in accepting or rejecting the hypotheses. These requirements rule out the use of a large number of financial ratios in combination with a search technique. We use logit analysis to estimate the influence of the above-mentioned variables on the probability of default.

The model is estimated using the SAS software package, adopting a procedure that estimates a binary logit model via maximum likelihood. Estimates of default probabilities are produced for the overall model. The quality of the forecast is evaluated with the concept of receiver operating characteristic-curve for which we report the accuracy ratio. We first also perform out-of-sample validation. We develop one model from the 1998-2003 training set (with 50% partition) and test this model on the 1998-2003 out-of-sample set. The training data set was used for preliminary model fitting. The validation data set was used to monitor and tune the model weights during estimation and was also used for model assessment. We used a stratified random sampling in order to maintain the same number of defaults to create partitioned data sets.

#### 4. Empirical findings

The results of the logit analysis specified in the previous section are summarized in Table 7, where the variables are defined as above. In this table, GCO shows the expected positive relationship with default at the 1% level of significance. The odds ratio tells us that the predicted odds of default for firms that received a GCO is 2.792 times the predicted default for firms that received a CO. Thus, we do not reject our main hypothesis (H1). We also computed <u>-2 log-likelihood of the model with (5,381) and without GCO (5,386). The likelihood ratio statistic is the difference between the -2 log-likelihood of each model with and without the omitted variable. We compare this difference (5.00) with the critical value from the chi-squared distribution with 1 degree of freedom (model without GCO to get the model with GCO). Thus, we have our chi-</u>

square statistic ( $x^2 = 5.00$ ), our predetermined alpha level of significance (0.05), and the degrees of freedom (1, model without GCO to get the model with GCO). In a chi-square distribution table with 1 degree of freedom we can\_see that  $x^2 = 5.00$  lies between 3.841 and 5.412. The corresponding probability is 0.05 . This is smaller than the conventionally acceptedsignificance level of 0.05 or 5%; so the null hypothesis that the two distributions are similar is $rejected. In other words, since our <math>x^2$  statistic =5.00 exceeds the critical value for a 0.05 probability level (3.841), we can reject the null hypothesis that the observed values of our  $x^2$  have the same theoretical distribution. A similar analysis for the hold-out-sample led to similar conclusion. This allows us to conclude that GCO has, in statistical terms, an incremental effect on our basic model of default (at the level of 5% level of significance). Thus, we can not reject H1b.

## INSERT TABLE 7 ABOUT HERE

The accounting controls CASHDEBT, FINANCOV, LIQUIDITY and SOLIDITY, are as expected negatively related to default at the 1% level of significance, not allowing us to reject H2 (a-d). SIZE is also negatively related to default as expected and significantly so at a 1% level of significance. This relationship also does not allow us to reject H3a. Surprisingly the relationship between AGE and default is positive and significantly so at a 1% level of significance. This relationship contradicts the sign we expected, not allowing us to confirm H3b. However, the magnitude of the coefficient is small (0.009) and the odds ratio is close to 1 (1.009). Nevertheless, one possible explanation could be that older firms are engaged in traditional sectors such as textile manufacturing which in recent years started facing competitive pressures in international markets from firms originating in China and India. Table 8 illustrates this point, showing default company distribution by age categories.

## INSERT TABLE 8 ABOUT HERE

Almost all industry dummies show a positive relationship with default (compared to OTHER sectors). PRIMARY, TRADE and TRANSPORT are not significant at any statistically meaningful level, and MANUFACTURING and CONSTRUCTION are significant at the 1% level. Compared to the remaining sectors, predicted odds of default are higher in these sectors, 2.938 and 2.751, respectively. TRADE (2.289) and TRANSPORT (1.928) have lower odds of default compared to the aforementioned sectors. Compared to these sectors HOSPITALITY

shows the lowest predicted odd of default (1.027). The results for region dummies are rather poor. With the exception of ALENTEJO and CENTER which are, respectively positively and negatively related to default at the 1% and 5% level of significance (compared to MADEIRA) none of the dummies shows a statistically significant result at any meaningful level. The predicted odds of firms from ALENTEJO are 1.597 times the predicted odds of default in other regions. This is also a region that has been subject of most desertification.

The quality of the forecast was evaluated using the concept of receiver operating characteristic curve. Table 9 shows that the area under the curve is 75% for the estimation sample and 77% for the hold-out-sample (with 50% partition) firms. The area below the curve has probabilistic significance and indicates the probability that any defaulting firm picked at random from the population will have an estimated score which is greater than that of any other non-defaulting firm selected at random.

#### INSERT TABLE 9 ABOUT HERE

We show the model's predictive power by applying the model to the hold-out-sample. The results are given separately for the groups of defaulting and non-defaulting firms in Table 10. The hold-out-sample consists of 5,689 non-defaulting firms and 411 defaulting firms. The model shows a good capacity to discriminate between defaulting and non-defaulting firms. The average default rate is almost three times for the default sample (17.78%) when compared with the non-default sample (6.05%). The variations in the default probabilities of the non-defaulting firms are also lower than the variations in the default probabilities of the defaulting sample. Few non-defaulting firms still get a very high default probability (92.37% is maximum) and a few defaulting firms get very low default probabilities (0.19% is minimum). In table 11, to supplement the above analysis we also show the error type I, broken down by 4 expected default frequency categories.

#### INSERT TABLE 10 AND 11 ABOUT HERE

Partitioning the sample by GCO and CO in Table 12 shows that in the non-defaulting group the average default rate for firms that receive a GCO is 9.92% and for the ones that get a CO it is 5.96%. In the defaulting group the average default rate for firms that receive a GCO is 35.49% and for the ones that get a CO it is 16.96%. For firms that receive a GCO (in comparison

to firms that received a CO) the standard deviation is 2.16% higher in the non-defaulting group and 6.18% higher in the defaulting group. These results from out-of-sample validation indicate a strong relationship between default and the variables used in the model. We also include test results of significant difference between the CO and GCO groups. In both samples, the probability of the Kolmogorov-Smirnov Z statistic falls well below 5%. By that standard, the distributions of the two groups (CO and GCO) are significantly different from each other. Default rates for different asset sizes for total sample are shown in Table 13. It can be observed that default rates are systematically higher for firms that receive a GCO. Surprisingly though, default rates tend to increase with size.

## INSERT TABLE 13 ABOUT HERE

Cross tabulation by age in Table 14 continues to show higher default rates for the group of firms that receive a GCO. However, unlike size, default rates for the group of firms that received a CO remain relatively stable for different age groups. For the group of firms that receives a GCO, default rates reduce with increasing age.

#### INSERT TABLE 14 ABOUT HERE

In Table 15 we tabulate the default rates across different sectors. With the exception of HOSPITALITY, the group of firms that received a GCO shows higher default rates. Standard deviation of these default rates is also higher for firms that received a GCO. PRIMARY, MANUFACTURING and CONSTRUCTION show larger differences in predicted default rates between firms that receive a GCO and a CO. Differences in other sectors are relatively small. In the tabulation for regions (Table 16) we observe that in ALENTEJO default rates for firms that receive a GCO are lower than the group of firms that received a CO. NORTH, LISBON, AZORES and MADEIRA show larger differences between firms that receive a GCO and firms that banks can effectively rely

#### INSERT TABLE 15 AND 16 ABOUT HERE

To check the robustness of our findings, we employed a dummy variable to verify a potential structural break for the introduction of the ISA 570. However, the dummy did not turn out to be significant. One possible explanation is that the auditors adopted the ISA 570 normative before its legal implementation. Geiger et al. (2005) found that auditors were more likely to issue prior going-concern modified audit opinion in the post-Enron era of 2002-03 than in the earlier 1991-1992 recession recovery period and less likely to have issued prior going-concern modified audit reports for bankrupt companies after the Reform Act of 1995. The current research used data from 1997 to 2003 in Portuguese Central Bank. Our data set spans the period 1997-2003. If data spanning the post-Enron period becomes available then it would certainly be desirable to analyze this issue in more detail. Overall, we cannot reject our main hypothesis relating to the influence of accounting factors on default (H2a-H2d) and our hypothesis relating to the influence of size of firm on default (H3a).

#### 5. Conclusions

The paper contributes to the existing literature on informational content conveyed by the auditor's GCO. It indicates that firms that receive a GCO are more likely to default in comparison to firms that receive a CO. The paper provides estimates of the odds of default for firms that receive a GCO. Further, the paper shows that GCO has incremental predictive ability over and above standard accounting and non-accounting factors that enable default prediction. Additionally, it documents default rates for firms that receive a GCO and firms that receive a CO across different asset classes, age of firms and industry and regions. Consistent with our expectation, firms that receive a GCO show higher default rates.

The analysis is embedded in the contemporary literature that explains default on the basis of accounting and non-accounting data. As suggested by the theory, the study finds that high levels of indebtedness, low financial coverage, liquidity and solvability increase the likelihood of default. Larger firms are also less likely to enter into default but, surprisingly, age is positively related to default.

Auditing standards which have required independent auditors to disclose the going concern uncertainty have been controversial. Some have argued that the disclosure provides little information to users. The primary purpose of our study was to determine whether the independent auditor's going concern evaluation had information content by examining whether firms default following issuance of a GCO and whether GCO carries incremental predictive ability. Previous studies (Firth, 1978; Elliott, 1982; Dodd et al., 1984) do not find a significant reaction to the GCO. This could be interpreted as an indication that there is little information content in the independent auditor's going concern disclosure, and that the controversial requirement for the disclosure should be abandoned. But the study by Jones (1996) shows that the extent of the abnormal returns surrounding the release of the auditor's report depended on the probability that a GCO would be received. He argues that the release of information in the 10-K concerning default or debt restructuring was also found to influence the market reaction. Thus, it is important to control for the influence of such information in default prediction which we confirm in our study. Overall, the results of our study provide additional support for the continuation of the requirement to disclose going concern uncertainties in the audit report. It also suggests that the independent auditor's going concern evaluation can reduce the opacity of financial statements that investors and creditors use to predict default.

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	,			
	Number	Number	Number	
Year	of	of	of	Default
	GCOs	defaults	accounts	frequency
1997	85	-	1,881	-
1998	75	131	1,942	6.96%
1999	45	115	1,826	5.92%
2000	40	102	2,192	5.59%
2001	24	180	2,166	8.21%
2002	11	150	2,192	6.93%
2003	-	144		6.57%
Total	280	822	12,199	6.74%

Table 1 GCOs , defaults and accounts 1997-2003

Table 2 Default frequency in various industries 1998-2003

Industry	1998	1999	2000	2001	2002	2003	Total
1-PRIMARY	7.63%	7.83%	7.84%	2.22%	4.00%	2.78%	4.99%
2-MANUFACTURING	67.18%	66.09%	61.76%	52.78%	59.33%	52.78%	59.25%
<b>3-CONSTRUCTION</b>	11.45%	12.17%	12.75%	11.11%	6.00%	9.72%	10.34%
4-TRADE	6.87%	5.22%	7.84%	20.00%	15.33%	13.19%	12.29%
<b>5-HOSPITALITY</b>	0.76%	1.74%	4.90%	2.22%	2.67%	1.39%	2.19%
6-TRANSPORT	5.34%	6.09%	2.94%	3.33%	4.67%	4.17%	4.38%
7-OTHER	0.76%	0.87%	1.96%	8.33%	8.00%	15.97%	6.57%
Total	100%	100%	100%	100%	100%	100%	100%

Table 3 Default frequency in various geographical regions 1998-2003

Geography	1998	1999	2000	2001	2002	2003	Total
1-NORTH	38.17%	37.39%	32.35%	34.44%	34.00%	36.81%	35.52%
2-LISBON	23.66%	26.96%	24.51%	23.33%	26.67%	22.92%	24.57%
3-CENTER	26.72%	22.61%	29.41%	33.89%	30.67%	34.03%	30.05%
4-ALENTEJO	5.34%	7.83%	10.78%	6.11%	7.33%	2.08%	6.33%
5-ALGARVE	2.29%	2.61%	1.96%	1.67%	0.67%	1.39%	1.70%
6-AZORES	2.29%	1.74%	0.98%	0.56%	0.67%	0.00%	0.97%
7-MADEIRA	1.53%	0.87%	0.00%	0.00%	0.00%	2.78%	0.85%
Total	100%	100%	100%	100%	100%	100%	100%

Industry	1998	1999	2000	2001	2002	2003	Total
1-PRIMARY	2.35%	5.33%	0.00%	2.50%	0.00%	0.00%	2.50%
2-MANUFACTURING	60.00%	62.67%	68.89%	50.00%	54.17%	36.36%	59.29%
<b>3-CONSTRUCTION</b>	3.53%	1.33%	2.22%	7.50%	8.33%	9.09%	3.93%
4-TRADE	24.71%	20.00%	22.22%	27.50%	16.67%	27.27%	22.86%
<b>5-HOSPITALITY</b>	1.18%	1.33%	0.00%	0.00%	0.00%	0.00%	0.71%
6-TRANSPORT	3.53%	2.67%	4.44%	2.50%	4.17%	9.09%	3.57%
7-OTHER	4.71%	6.67%	2.22%	10.00%	16.67%	18.18%	7.14%
Total	100%	100%	100%	100%	100%	100%	100%

Table 4 GCO frequency in various industries 1998-2003

Table 5 GCO frequency in various geographical regions 1998-2003

			0				
Geography	1998	1999	2000	2001	2002	2003	Total
1-NORTH	37.65%	38.67%	40.00%	32.50%	41.67%	45.45%	38.21%
2-LISBON	20.00%	20.00%	22.22%	20.00%	16.67%	9.09%	19.64%
<b>3-CENTER</b>	36.47%	36.00%	31.11%	45.00%	41.67%	45.45%	37.50%
4-ALENTEJO	2.35%	2.67%	2.22%	0.00%	0.00%	0.00%	1.79%
5-ALGARVE	1.18%	2.67%	4.44%	0.00%	0.00%	0.00%	1.79%
6-AZORES	1.18%	0.00%	0.00%	0.00%	0.00%	0.00%	0.36%
7-MADEIRA	1.18%	0.00%	0.00%	2.50%	0.00%	0.00%	0.71%

	Non-default sample	Default sample
Average figures 1997-2002	1998-2003	1998-2003
GCO	2.18%	3.89%
Accounting controls		
CASHDEBT	71.75%	1.02%
FINANCOV	27.20	15.25
LIQUIDITY	4.02	2.11
SOLIDITY	32.89%	18.13%
Non-accounting controls		
SIZE	4.16	3.79
AGE	24.48	28.44
Industry Dummies		
1-PRIMARY	4.36%	4.99%
2-MANUFACTURING	46.19%	59.25%
<b>3-CONSTRUCTION</b>	10.18%	10.34%
4-TRADE	21.73%	12.29%
5-HOSPITALITY	2.56%	2.19%
6-TRANSPORT	4.68%	4.38%
7-OTHER	10.31%	6.57%
Region Dummies		
1-NORTH	36.11%	35.52%
2-LISBON	23.26%	24.57%
3-CENTER	32.65%	30.05%
4-ALENTEJO	3.67%	6.33%
5-ALGARVE	2.04%	1.70%
6-AZORES	1.08%	0.97%
7-MADEIRA	1.19%	0.85%

Table 6 Default and non-default sample ratios

			Wald	p-	
Variables	В	S.E.	Chi-squares	value	Exp(B)
GCO	0.513	0.113	20.57	0.000	2.792
Accounting controls					
CASHDEBT	-0.397	0.092	18.81	0.000	0.672
FINANCOV	-0.374	0.118	9.96	0.002	0.688
LIQUIDITY	-0.197	0.100	3.86	0.050	0.821
SOLIDITY	-2.195	0.239	84.42	0.000	0.111
Non-accounting controls					
SIZE	-1.412	0.205	47.41	0.000	0.244
AGE	0.009	0.002	13.83	0.000	1.009
Industry dummies					
1-PRIMARY	0.122	0.228	0.29	0.592	2.102
2-MANUFACTURING	0.457	0.109	17.72	0.000	2.938
<b>3-CONSTRUCTION</b>	0.392	0.157	6.22	0.013	2.751
4-TRADE	0.207	0.171	1.47	0.225	2.289
5-HOSPITALITY	-0.594	0.307	3.74	0.053	1.027
6-TRANSPORT	0.036	0.215	0.03	0.867	1.928
Region dummies					
1-NORTH	-0.166	0.132	1.58	0.209	0.784
2-LISBON	-0.035	0.144	0.06	0.811	0.893
3-CENTER	-0.268	0.132	4.12	0.042	0.707
4-ALENTEJO	0.546	0.214	6.53	0.011	1.597
5-ALGARVE	-0.184	0.354	0.27	0.603	0.769
6-AZORES	0.029	0.393	0.01	0.942	0.952
Log likelihood	5,711				
Cox & Snell R <sup>2</sup>	0.619				
Nagelkerke R <sup>2</sup>	0.824				
Hosmer-Lemeshow	40,195				

Table 7 Estimation results of the LOGIT model

GCO: Going Concern Opinion [dummy: 0=CO (Clean Opinion); 1=GCO] CASHDEBT: Cash Flow to Debt (realized operational profits/debt obligations) FINANCOV: Financial Coverage (earnings before interest and tax/financial costs) LIQUIDITY: Liquidity (current assets/current liabilities) SOLIDITY: Solvability (equity/total assets)

SIZE: Total Assets (log millions of euros)

AGE: Years of existence

Industry			Per y	ear's age f	firm		
mausuy	<=2	]2;5]	]5;10]	]10;20]	]20;50]	>50	Total
1-PRIMARY	16.67%	2.78%	5.61%	4.15%	6.27%	2.92%	4.99%
2-MANUFACTURING	33.33%	41.67%	45.79%	57.14%	62.07%	72.26%	59.25%
<b>3-CONSTRUCTION</b>	0.00%	8.33%	8.41%	8.76%	13.79%	7.30%	10.34%
4-TRADE	50.00%	22.22%	19.63%	15.21%	8.15%	7.30%	12.29%
5-HOSPITALITY	-	2.78%	0.93%	2.30%	2.51%	2.19%	2.19%
6-TRANSPORT	-	8.33%	7.48%	3.69%	3.76%	3.65%	4.38%
7-OTHER	-	13.89%	12.15%	8.76%	3.45%	4.38%	6.57%
Total	100%	100%	100%	100%	100%	100%	100%

Table 8 Default frequency in various industries 1998-2003, by age

Table 9 Area under the ROC-curve

	Ν	Area	Std. Error	95% Confide	ence Interval
				Lower	Upper
Total sample					
With GCO	12,199	0.750	0.009	0.732	0.769
Without GCO	12,199	0.743	0.010	0.724	0.762
Hold-out-sample					
With GCO	6,100	0.765	0.013	0.739	0.791
Without GCO	6,100	0.759	0.013	0.733	0.785

Table 10 Descriptive statistics for default and non-default hold-out-sample

non-derault nond-out-s	ampie	
Descriptive statistics	Non-default	Default
predicted EDTS	1770-2005	1770-2005
Ν	5,689	411
Mean default rate	6.05%	17.78%
Standard deviation	6.51%	19.11%
Maximum default		
rate	92.37%	95.21%
Minimum default		
rate	0.00%	0.19%
99%	31.72%	91.03%
95%	16.66%	66.41%
50%	4.40%	11.27%
5%	0.43%	1.43%

		Observed	Predi	cted
EDFs	Ν	default	Non-Default	Default
			(error type I)	(correct)
100-75	19	13	0	13 (100%)
74-50	26	18	0	18 (100%)
49-25	135	54	1 (1.9%)	53 (98.1%)
24-0	5,920	326	5 79 (24.2%)	247 (75.8%)

Table 11 Error Classification

Table 12 Descriptive statistics default and non-default hold-out-sample, by GCO

\_\_\_\_\_

Descriptive statistics predicted EDFs		Non-c 1998	lefault -2003	Default 1998-2003	
		СО	GCO	CO	GCO
Ν		5,572	117	393	18
Mean defaul	t rate	5.96%	9.92%	16.96%	35.49%
S.D.		6.43%	8.59%	18.45%	24.63%
			Non-default	Predicted probability	Default
Most		1 5		1 2	
Extreme					
Differences	Absolute	.289	.248	.541	.222
	Positive	.289	.118	.541	.143
	Negative	037	248	.000	222
Kolmogorov	Kolmogorov-Smirnov Z		2.653	2.245	.922
Asymp. Sig.	(2-tailed)	.000	.000	.000	.363

		·,	- )				
Descriptive statistics	Basic	ros)					
predicted EDFs	Model	<=0,5	]0,5;1,5]	]1,5;5]	]5;10]	]10;50]	>50
Number of obs.	12,199	112	809	3,555	2,729	3,671	1,323
CO	11,919	5.22%	5.39%	5.85%	6.92%	7.19%	8.75%
GCO	280	9.68%	6.64%	11.81%	13.25%	10.19%	12.03%

Table 13Mean default rate total sample companies, by size vs auditor's opinion

Table 14 Mean default rate total sample companies, by age vs auditor's opinion

Descriptive statistics	Basic	Per year's age firm									
predicted EDFs	Model	<=2	]2;5]	]5;10]	]10;20]	]20;50]	>50				
Number of obs.	12,199	123	800	1,916	3,361	4,614	1,385				
CO	11,919	6.70%	6.69%	6.26%	6.12%	6.54%	9.87%				
GCO	280	13.86%	10.32%	9.53%	9.83%	13.60%	11.19%				

Descriptive statistics predicted EDFs	1-PRIM	IARY	2-MANUFA	-MANUFACTURING 3-CONSTRUCTION					4-TRADE 5- HOSPITALITY			6-TRANSPORT		7-OTHER	
	CO	GCO	CO	GCO	CO	GCO	CO	GCO	CO	GCO	CO	GCO	CO	GCO	
N	530	7	5,576	166	1,232	11	2,509	64	307	2	558	10	1,207	20	
Mean default rate	7.59%	10.67%	8.31%	14.35%	6.78%	13.73%	3.87%	6.07%	5.86%	0.63%	6.33%	6.53%	5.75%	6.87%	
S.D.	7.24%	9.21%	8.00%	13.50%	5.08%	7.94%	5.09%	9.01%	9.49%	0.01%	7.30%	6.63%	7.66%	3.46%	
Maximum default rate	79.67%	22.23%	87.71%	91.48%	59.81%	36.55%	85.31%	45.97%	71.80%	0.64%	82.49%	18.11%	79.70%	13.48%	
Minimum default rate	0.10%	0.95%	0.00%	0.06%	0.04%	6.17%	0.00%	0.08%	0.05%	0.62%	0.01%	0.04%	0.00%	1.05%	
99%	31.43%	-	39.61%	86.31%	26.80%	-	20.95%	-	55.98%	-	37.92%	-	40.75%	-	
95%	20.60%	-	20.93%	41.26%	16.23%	-	9.60%	31.34%	25.31%	-	18.23%	-	16.72%	13.40%	
50%	5.67%	14.67%	6.59%	12.13%	5.75%	12.76%	2.86%	3.22%	2.17%	0.63%	4.36%	4.69%	3.62%	6.30%	
5%	1.28%	0.95%	1.05%	1.54%	1.70%	6.17%	0.24%	0.23%	0.44%	0.62%	0.46%	0.04%	0.38%	1.13%	

Table 15 Descriptive statistics total sample companies, by sector vs auditor's opinion

Table 16 Descriptive statistics total sample companies, by region vs auditor's opinion

Descriptive statistics predicted EDFs	1-NO	RTH	2-LISI	2-LISBON		3-CENTER		4-ALENTEJO		5-ALGARVE		6-AZORES		7-MADEIRA	
	CO	GCO	CO	GCO	CO	GCO	CO	GCO	CO	GCO	CO	GCO	CO	GCO	
N	4,293	107	2,793	55	3,857	105	465	5	241	5	130	1	140	2	
Mean default rate	6.53%	11.05%	6.92%	15.75%	6.15%	9.34%	11.11%	7.15%	5.64%	7.97%	5.95%	26.84%	16.47%	34.13%	
S.D.	6.86%	10.85%	6.96%	17.62%	7.28%	9.05%	9.70%	3.86%	8.15%	5.24%	5.35%	-	11.00%	16.75%	
Maximum default rate	85.51%	83.77%	87.71%	91.48%	85.31%	54.06%	59.64%	10.84%	63.77%	13.48%	33.64%	26.84%	54.44%	45.97%	
Minimum default rate	0.00%	0.08%	0.00%	0.42%	0.00%	0.04%	0.00%	0.67%	0.10%	2.36%	0.05%	26.84%	0.87%	22.28%	
99%	36.20%	81.55%	29.57%	-	36.22%	53.56%	43.75%	-	44.79%	-	29.62%	26.84%	52.59%	-	
95%	16.06%	26.50%	17.48%	61.59%	17.00%	30.47%	29.45%	-	24.67%	-	17.65%	26.84%	38.38%	-	
50%	5.02%	9.14%	5.28%	12.40%	4.33%	6.88%	9.11%	8.04%	3.32%	9.58%	4.14%	26.84%	13.58%	34.13%	
5%	0.74%	0.89%	0.63%	0.58%	0.54%	0.45%	0.53%	0.67%	0.41%	2.36%	0.47%	26.84%	3.14%	22.28%	