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Research Note

# Corporate Risk Disclosure and Audit Fee: A Text Mining Approach

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## Abstract

The aim of this study is to introduce an innovative text mining approach to assess firms' risks using unstructured textual disclosure from annual reports. Specifically, we use Natural Language Processing techniques to extract firms' self-identified risks including financial, strategic, operational, and hazard risks based on an enterprise risk management framework. We examine the association between these four risk measures derived from the risk factor section in 10-K filings and audit fees. The results show that audit fees are significantly and positively related to firm-specific financial, strategic, and operational risks, indicating the informativeness of corporate textual risk disclosures. This study provides direct support for the recent US reporting regulatory requirement of adding a new section on risk factors in corporate annual reports.

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## Notes

1 Unstructured data refer to information that either does not have a pre-defined data model or is not organized in a pre-defined manner. It is typically text-heavy and often includes multimedia content. While some files may have an internal structure, they are still considered unstructured because the data do not fit in a database (Feldman & Sanger, [2007](#)). In contrast, structured data like spreadsheets are easily searchable by basic algorithms. Therefore, it is more difficult to analyze unstructured textual documents than structured ones.

2 The number of observations drops by 10,266 due to the calculation of RESTPROB and ACCR. In untabulated analysis, we re-run our tests excluding these two variables and the results still hold.

3 In the main analysis, we use industry-adjusted risks, measured as the difference between the number of risk sentences from the risk factor section and the industry-median of the sentence count number based on the three-digit SIC industry code in a given year. In the untabulated robustness check, we also use raw risks, measured as the count number of risk sentences from the risk factor section. Our results remain qualitatively unaltered.

4 In addition to the total number of sentences in 10-Ks as a control variable, we recalculate the level and change of raw risk measures deflated by the total number of sentences in 10-Ks and re-estimate the model (1). Our main results still hold.

5 Following Doyle et al. ([2007](#)), for our pre-404 period, we start with firms that had a 404 audit in the initial year of the 404 audit, that is, the fiscal year ending on or after

15 November 2004. Then, we trace back one year to obtain ICMW in year 2003. In untabulated tests, our main results presented in [Table 5](#) remain almost identical no matter we code ICMW using IC weakness under SOX 302 in 2003 or for the entire sample period.

6 For example, one standard deviation of increase in financial risk for a median firm is related to increase in audit fee by \$18,256 ( $\$1,005,504 * 0.001 * 18.156$ ).

7 The insignificant coefficient on the hazard risk could be the results of imprecise estimation due to the low variance of independent variables.

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## Additional information

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