# BUSINESS FAILURES: PREDICTION AND THE INFORMATION CONTENT OF AUDITORS\* OPINIONS

by

Kooi Ong, Tong

B.A., Simon Fraser University, 1982

# THESIS SUBMITTED IN PARTIAL FULFILLMENT OF THE REQUIREMENTS FOR THE DEGREE OF

MASTER OF ARTS

in the Department

of

Economics

© Kooi Ong, Tong 1984
SIMON FRASER UNIVERSITY

May, 1984

All rights reserved. This work may not be reproduced in whole or in part, by photocopy or other means, without permission of the author.

#### APPROVAL

Name:

Kooi Ong Tong

Degree:

Master of Arts

Title of Thesis:

Business Failures: Prediction and the Information Content of Auditors'

Opinions

Examining Committee:

Chairman:

Clyde G. Reed

Daniel McDonald Senior Supervisor

Dennis R. Maki

Turgut Var External Examiner

Professor

Faculty of Business Administration

Simon Fraser University

Date Approved: June 4, 1954

#### PARTIAL COPYRIGHT LICENSE

I hereby grant to Simon Fraser University the right to lend my thesis, project or extended essay (the title of which is shown below) to users of the Simon Fraser University Library, and to make partial or single copies only for such users or in response to a request from the library of any other university, or other educational institution, on its own behalf or for one of its users. I further agree that permission for multiple copying of this work for scholarly purposes may be granted by me or the Dean of Graduate Studies. It is understood that copying or publication of this work for financial gain shall not be allowed without my written permission.

Title of	Thesis/Proj	ect/Extended	Essay				
Busines	ss Failures:	Prediction	and the	Informati	on Cont	ent of	
Auditor	rs' Opinions	-					8
			Helitaria (III. de la companya de l				
							ale. U vez e el culturato ele
	- <del>Georgia</del> crisilis sillisticità — <del>Gl</del> ei dicare cipra si que — acci — a capaça	and an extension of the second se	- AND THE STATE OF	AND THE PARTY OF T		<u> </u>	
Author:	tsignat	ure)	n, a annu neo <b>f</b> err v e r r e e e e				.*
	Kooi Ong	Tong					
	(name						
	June 4, 1	984					

(date)

#### ABSTRACT

one purpose of financial reporting is to assist readers in assessing the solvency of a firm. In the past the auditors would issue a "subject to" audit opinion when they had serious reservations as to the continuity of the firm. In Canada the auditing profession have discontinued the use of this "subject to" opinion and in the United States they are debating discontinuing it. This thesis concludes that the "subject to" opinion does have information content pertinent to the financial markets and questions the wisdom of discontinuing its use.

The methodological hurdle is that financial markets receive the auditor's report at about the same time they receive the financial data contained in the financial statements. An observed reaction in the financial markets cannot easily be ascribed to either the information in the auditor's report or to the information in the financial statements. It is likely the market reacts to both. Yet the task is to see whether or not it reacts uniquely to the "subject to" opinion of the auditor.

This study controls for the information in the financial statements by using a multiple discriminant analysis (MDA) bankruptcy prediction model. Sixteen financial ratios for twenty-two of the eighty-six firms were used as the independent variables in the analysis stage to determine the MDA prediction model. The remaining firms were used to test the predictive power of the MDA model in a subsequent period and to control for differential effects of the auditor's report.

Eight portfolios were then formed based on: (i) bankrupt versus non-bankrupt firms, (ii) whether the auditor's report contained a "subject to" opinion, and (iii) whether the firm was predicted bankrupt by the MDA model. The results of the market response to these portfolios suggested that there was information content in "subject to" opinions. It was also found that the MDA model performed better than the "subject to" opinions in predicting insolvency. Finally, the evidence indicates that the issue of a "subject to" qualification could be a self-fulfilling prophecy.

# DEDICATION

To Chau Ting for her love, patience, understanding and encouragements during the past few years.

#### ACKNOWLEDGEMENTS

There are many who have helped, advised and encouraged me during the past few years. I will inevitably but unintentionally omit some of them. To each and everyone of them, I offer my thanks.

some debts too great not to mention. I am indebted to Dr. Daniel McDonald, my senior supervisor and help, support and encouragement were invaluable. This thesis could not have been written without him. I also credit him for my interest in accounting and finance. I am also indebted to Dr. Dennis Maki for his comments, suggestions and encouragements which he willingly accorded me throughout the writing of this thesis. A special debt is owed to Dr. Shiraz Adam who provided me with much computing assistance which I deeply appreciate. A debt of gratitude is also owed to Mr. C. S. Lum who provided detailed comments and suggestions. I have also benefitted from Dr. Irene Gordon, who first introduced ne to Based Accounting Research. The Faculty of Business Administration provided me with financial assistance for which I am grateful.

Finally, I acknowledge a special and enormous debt to my parents who consistently encouraged and supported my educational aspirations.

# TABLE OF CONTENTS

Approvalii
Abstractiii
Dedicationv
Acknowledgementsvi
LIST OF TABLESix
LIST OF FIGURES AND PLOTS
I. Introduction1
II. Literature Review8
Market Based Accounting Research (MBAR) studies 10
Survey Studies
Predictive Ability of ST opinion studies20
General Comments21
Prediction versus Classification27
Prediction of Bankruptcies using MDA studies28
Brief Summary
III. Research Design
The sample
The Statistical Method
Fcotnotes Disclosure
Building a bankruptcy prediction model39
IV. The Empirical Results49
The Predictive Ability of ST opinions versus an MDA Model49
The Information Content of ST Opinions51
Self-fulfilling Prophecies

V. Co	onclusion .			• • • • • • • • • • • •	74
<b>1</b>	.imitations	and Exten	sions		77
Reference	es		•• • • • • • • • •		79
Appendix	A		*******		******* 84
Appendix	E		********	• • • • • • • • • • •	86
Appendix	c		• > • • • • • • • • •		
Appendix	P			• • • • • • • • • •	89
Appendix	E	• • • • • • • • • •	• • • • • • • • • •		91
Appendix	F	*****	••••••		93
Appendix	G		********		95
Appendix	Н			* * * * * * * * * * * * *	97
Appendix	I				

# LIST OF TABLES

TABL	E PA	AGE
1	Market Response to "Subject To" Reports and Model	
	Predictions	4
.1 A	Financial Statements at a Point in Time as Information	54
1 B	Market Response to "Subject To" Reports and Model	
	Predictions (The Evidence)	55
1C	Changes in Opinions and/or Predictions as Information.	56
2	Readership and Understanding of the Auditor's Report .	16
3	Preferred Disclosure for Several Contingencies	18
4	Comparison of the MDA Model to the Auditors' Opinions.	22
5	A Summary of Past Studies that uses MDA Models	29
6	Model Building	40
7	Discriminant Function Coefficients	4,4
8	The Results of the Prediction	46
9	The Results of the Prediction: Using a New Criterion .	48
10	Predictive Accuracy of the "Subject To" Opinions	50
11	T-test for the D.A.R. of each of the Portfolios	<b>5</b> 3
12	The Exact Test for 2 X 2 Tables	7:1
13	Self-fulfilling Prophecy with respect to MDA Model	
	Prediction	73
14	Self-fulfilling Prophecy with respect to "Subject To"	
	Opinion	7.3

# LIST OF FIGURES AND PLOTS

FIGUR		PAGE
1	Using the Approximate Date of Impact in MBAR Studies	25
2	Prediction Versus Classification	27
.3	An Illustration of the Use of Research Time	41
4	A Summary of the Analysis and Prediction Stage	42
PLOT		
1	Market Response to Portfolio 1	57
2	Market Response to Portfolic 2	58
3	Market Response to Portfolio 3	. 59
4	Market Response to Portfolics 1A and 3A	60
5	Market Response to Portfolios 2B and 3B	61
6	Market Response to the Control Portfolios	62
7	Market Response to Groups 2, 3 and 4	63
8	Market Response to Control Group 7	64
9	Cumulative Residuals of All the Firms in the Sample.	65

#### I. Introduction

Statement of Financial Accounting Concept Number 1 states that one of the objectives of financial reporting is that it should provide information about factors that may affect an enterprise's liquidity or solvency. Solvency evaluation by users of financial statements may come in two forms: explicitly through the auditor's opinion (a clean or a "subject to" (ST) opinion with respect to going concern2) and/or through the analysis of the financial statements (the most popular of which is the use of financial ratios, as in bankruptcy prediction models). 3

The Cohen Commission on Auditors' Responsibilities (1977-78) recommended that the audit requirement for expression of a "subject to" qualification when material uncertainties exist be eliminated. While this issue is still being considered by the American Institute of Certified Public Accountants (AICPA), the Canadian Institute of Chartered Accountants (CICA)

Financial Accounting Standards Board. Statement of Financial Accounting Concepts Number 1, "Objectives of Financial Reporting by Business Enterprise". November, 1978. Paragraph 49, page 24.

<sup>2</sup>See Appendix I for a sample of ST opinion.

This includes footnote disclosures. See chapter 3 for elaboration and justification of this point.

<sup>\*</sup>American Institute of Certified Public Accountants, Commission on Auditors' Responsibilities: Report, Conclusion and Recommendations. New York, (AICPA, 1978) pp.29.

in November 1980 has terminated the use of that qualification. 5 since then, some research on the relevance of the ST opinion6 has been performed. Some of these studies uses the Market Accounting Research (MBAR) method 7 while others uses the survey technique. However, these studies (especially those using the MBAR approach) may not valid because of be their The financial markets receive the auditor's report at about the same time they receive the financial data contained in the financial statements. An observed reaction in the financial markets cannot easily be ascribed to either the information the auditor's report or to the information in the financial statements. Yet, we need to see if the markets react uniquely to auditor's report in order to infer the relevance of the ST opinions. As Bailey (1982) suggested (with respect to those studies that uses the MBAR method):

To draw conclusions about the information content of audit results, one must isolate the effects of information conveyed specifically by the audit report components of the aggregate signals. To do so, the information conveyed by the aggregates must be controlled. (pp. 141)

<sup>5</sup>CICA Handbook, section 5510.54.

<sup>6</sup> ST opinion will refer to only uncertainty qualifications with respect to going-concern, for the rest of this thesis.

<sup>7</sup>This method basically uses the ex-post returns of a security as the dependent variable and the market returns for the same time period as the independent variable. The parameters of this equation are then estimated. These parameters are then used to forecast the returns of the security subsequent to the period used earlier. The difference between the actual returns and the forecasted returns are then used to determine the effects, if any, of the event in question.

The studies date, using the MBAR approach, have not done to isolated the information content of the audit report from the statements.8 To overcome this problem. Bailey suggested the use of a questionaire approach to elicit the information content of ST opinions, as was done by some studies. This technique is, however, subject to the problems of securing acceptable response rate, and biases inherent hypothetical setting.

The primary purpose of this thesis is to attempt overcome the problems of previous studies using the Market Based Accounting Research (MBAR) method to evaluate the information of "subject to" audit reports. A new dimension is introduced to isolate the information content of "subject to" reports from the aggregate financial statements. This is done in the context of a bankruptcy prediction model which uses the information from the financial statements. Using the predictions of the model to control for the information content of financial statements, the information content of "subject to" report is then isolated from the overall contents of financial statements. The procedure in which this is done is summarized and explain in Table 1.

An assumption made in this thesis is that the financial market is efficient in the semi-strong form for the firms in the

<sup>8</sup> Some authors attempt to isolate the information content of audit report from the financial statements by matching a sample of firms with the change in earnings [Elliot, 1982]. See chapter 2. This assumes that the only relevant information in the financial statement is the net income figure of a firm.

TABLE 1

MARKET RESPONSE TO "SUBJECT TO" REPORTS AND MODEL PREDICTIONS.

	an entre san refer san entre entre san san san san e			
	MARKET RES  Warranted  Bank. Firms   (a)	Not warr.	•	RESPONSE  Not warr.  Bank. Firms   (a)
With "subject-to" reports and predicted to go	Market  correctly  responded  to both and  to other	Market  fooled by  both the  info.	1.3 Market uses other info. and was correct to ignore both the information	not use the  two info.  when it  should.
with "subject-to" reports and not predicted to go bankrupt.  (a) Bankrupt Firms  (b) Non Bankrupt Firms	Market  correctly  responded  to audit  reports and	Market was  fooled by  auditors'  reports. 	Market was correct to ignore the reports and uses the	not use the  auditors'   reports   when it  should.
No "subject-to" report but predicted to go bankrupt.  (a) Bankrupt Firms	Market  correctly  ignore the  reports and  uses fin.  statements  info. and  other info.	Market  fooled by  fin. stat-  ment pred-  ictions.  It was  wrong to  ignore the  reports.	Market was correct to	misled by the absence of a "subject to"
No "subject-to" report and not predicted to go bankrupt.	4.1  Market  correctly  ignore both  and uses  other info.	4.2  Market  responded  incorrect-  ly by  ignoring  the audit  reports	4.3   Market   responded   correctly   to both   the info.   and other   available   information	4.4   Market   fooled by   the   auditors     reports and   /or the   financial   statement   predictions

Bank. refers to Bankrupt.

sample. The firms are either traded on the New York Stock Exchange or the American Stock Exchange and there is good evidence that these two markets are semi-strong efficient. Also, the information from the financial statements and the auditors' reports is a small component of the total information available to the financial market. Firms in portfolio 1 are expected to fall in cell 1.1 since it is expected that the predictions model and the indications in the auditors' reports are generally correct and the market is expected to react to in portfolio 4 are likewise expected to fall in cell 4.3 for the same reason as above. Firms in portfolio 2 are expected be in cell 2.1 or 2.3 depending on whether the prediction of the model or the indication of the auditors' reports superior. Similarly for firms in portfolio 3, they are expected to fit into either cell 3.1 or 3.3. I have no prior beliefs to which prediction is superior but if the paper by Altman and McGough (1974) is any indication, the prediction of the model could be expected to be superior. If the market is reacting to the model prediction as information, then cells 2.3 and would be expected.

The role of accounting is to report relevant information for decision making to users of accounting information. If the indication that a firm is or might be in financial difficulty, as disclosed in the audit report, is relevant information, then such information should continue to be reported. On the other hand, if the financial market consistently ignores the "subject

to" opinions because they are misleading or inconsistent or because the market has other, superior, information, then auditing firms should not waste their resources determining if a "subject to" qualification is required. Although unlikely, it is possible that the market may ignore the "subject to" reports even when they are not misleading or inconsistent and can serve as a good predictor. Then it appears that the accounting profession may find it worthwhile to educate the public on the use and usefulness of their auditors' reports.

The following propositions are made in this thesis:

- 1. If the "subject to" reports generally predict correctly and are seen as relevant information to the financial market, then they are potentially beneficial and since the preparation of the report is not particularly costly, auditing firms should continue to provide this qualification when they deem necessary. Problems arise if the observed results were a self-fulfilling prophecy, that is, if the issue of the qualification itself causes a firm to go bankrupt. This possibility will be tested in chapter 4.
- 2. If the "subject to" reports predict at least as well as the prediction model, but are not seen as relevant information in the financial market, then this implies that investors do not understand the usefulness of auditors "subject to" qualifications. Instead of eliminating the reports, the accounting profession should educate the public on their usefulness. It would be less costly to society for an

auditing firm to look into possible insolvency of a business and make the information public than for individuals and firms to carry out the task themselves for their private use.

- 3. If the "subject to" reports do not predict as well as the MDA prediction model, but are seen as relevant information in the financial market, then auditors should make use of the prediction model to help them decide if a qualification should be issued. This does not imply that auditors should issue the qualification depending on the outcome of the prediction model alone.
- 4. If the "subject to" reports do not predict as well as the prediction model and are not seen as relevant information in the financial market, then obviously the market has other information on the possibility of a firm becoming insolvent that is superior to the auditors' reports. Issuing the reports may be a waste of resources.

A word of caution is needed here. In order to determine if "subject to" reports should be eliminated, one must determine if they generate net positive social gains. However, the propositions above can be seen as a first approximation or rule of thumb regarding the usefulness of the "subject to" reports.

#### II. Literature Review

In March 1977, the Cohen Commission on Auditors' Responsibilities reached it's tentative conclusion that the requirement to express a "subject to" (ST) opinion be eliminated. The following reasons were given to support their conclusion:

- 1. The responsibility of the auditor to include specific information on uncertainties in his report is inconsistent with his role in expressing an opinion on the presentation of other aspects of financial statements. Normally an auditor evaluates whether the financial information presented by management conforms with appropriate standards. But for uncertainties, the auditor is required to be a reporter and interpreter of financial information as well.
- 2. The meaning and significance of a "subject to" qualification are difficult to understand and confusing to users. The phrase "subject to" is ambigious and there is no way to tell if the auditor's intention is only to highlight information more fully disclosed elsewhere or to indicate a deficiency in the financial statement.
- 3. Some auditors are known to qualify their opinions for some material uncertainties and the absence of such qualification may lead financial statement users to believe a company

  The same conclusion was made in the Commission's final report in 1978.

faces no uncertainties that could materially affect its financial condition. All companies, however, faces a variety of economic risks.

- 4. The compliance with the requirement for gualifying an opinion because of an uncertainty provides little or no protection to the auditors when and if a firm liquidates.
- 5. There is no reason to believe independent auditors are able to predict accurately whether a company will liquidate.
- 6. A "subject to" opinion is not intended to be a prediction of liquidation, but many financial statement users apparently view it as such. Creditors often regard the "subject to" qualification as a separate reason for not granting a loan and thus the auditor's qualification tends to be a self-fulfilling prophecy.

A majority of the conclusions given above by the Commission were reached without any empirical evidence. That compliance with the requirement provided no legal protection was based on two legal cases. Altman and McGough's (1974) findings were used to support their conclusion that auditors are not better able to predict bankruptcy when compared to a bankruptcy prediction model.

Since then, a number of studies have provided some empirical evidence regarding points 2 and 5. The evidence as of today is however, not conclusive. These studies either use MBAR or survey techniques. The review of past studies in this chapter mainly deals with those studies that were at least partly

concerned with going-concern qualification. For a more thorough review of studies that were concerned with any or all different qualifications, see Estes (1982).

# Market Based Accounting Research (MBAR) studies

Alderman (1977) :

Concluded that uncertainty qualification (he failed differentiate the different types of qualifications) had little information value. His sample consists of 20 firms that received qualification at least once during 1968-1971 and had clean opinions for the three years immediately preceding the initial qualification. A control sample of 20 firms that had only clean opinions during 1965-1974 were then chosen by a random process. The market model was used in this study, that is Rit =a,+hR\_++u\_ where Rit = return for security i at time t, Rmt = return for the market at time t and u,=the residuals of the equation. The equation was run for the three year period preceding the first uncertainty qualification and the three year period subsequent to the initial qualification. The number of firms significant change 10 in the systematic risk component, or was two for both the experimental and the control sample. This led him to conclude that the ST qualification had little market-assessed risk and therefore qualifications had little informational value. Besides the small sample size, unclear if he used daily, weekly or monthly returns data.

<sup>10</sup>At the 0.05 level.

#### Firth (1978):

The impact of different qualifications on the market was studied using U.K. firms. Using the largest 1500 stock-exchange firms, he found 247 firms with qualified opinions for the two year period 1974-1975. Of these, 35 were qualified for uncertainties with respect to going-concern. Using the market model and 60 monthly returns, ending one month prior to earnings announcement, the parameters of the model for each security were estimated. The residuals were then calculated for the beginning 20 days prior to the release of the audit qualification and ending 20 days after the release. Since earnings and dividends announcements are made several weeks prior to the release of the published annual reports, the information on earnings (if any) will already be incorporated in the share price before the period studied. By assuming that this will isolate the information of the qualification itself apart from the aggregate financial statement, any market response subsequent to the date of release of the annual reports was attributed to the qualification. A control sample was formed where each qualified firm was paired with a "clean" firm in the same year, same industry and of approximately the same size market capitalization. For the experimental sample, terms significant drop in the there was a cumulative residuals, which was almost instantaneous, while this was not the case for the control sample. This led him to conclude that price there is significant adjustment with respect to

"going-concern" qualifications. Significant price adjustments also took place for "asset valuation" qualifications but this was not the case for the other qualifications which were also examined.

Ball, Walker and Whittred (1979):

They studied the market reaction to various forms of qualifications in Australia. Although they did not "going-concern" qualifications separately, they significant 1 market reaction for their sample as a whole (that is, for all qualifications) using weekly returns. They also found no significant reduction in share prices when a valuation qualification is issued. Their sample consisted of 141 companies with 194 qualifications during the period 1961-1972. A point to note is that the sample excluded firms that were delisted prior to January 1973 as the firms were selected from the industrial lists of the Australian Associated Stock Exchange at January 1973. They argued that by selecting only firms that were not delisted during 1961-1972, they were attempting to control the information other than the opinion itself. Their sample consistent with my Portfolio 2(b). However, by eliminating all firms that did fail during the period, they were eliminating firms where the ST opinion was correct but retained those where it was incorrect. They, therefore, could not address the as to whether the market reacts to those firms that did subsequently fail at the time the qualification was 11At the 0.10 level.

Finally, I suspect few firms in their sample were qualified with respect to "going-concern". Firms that subsequently failed are more likely to be those that receive a qualification with respect to "going-concern", as is evident from my data [see Table 10, Chapter 4]. On top of this, only a small percentage of all qualified opinions are qualified with respect to "qoing concern". This percentage is merely 14% in Firth (1978) and in Elliot (1982).12 Even if there are a few firms that correspond to my Portfolio 2(b) 13, the use of weekly (instead of daily) security returns may not indicate any market reaction simply because the market readjusted after it had initially reacted. Remember again that this is a portfolio of firms that did not subsequently go bankrupt or become delisted. The results my thesis indicate that the market corrected itself within a few days. 14

Elliot (1982):

A total of 145 firms with qualified opinions were selected, of which 16 were qualified with respect to going-concern and 46 with respect to asset realization. Factors other than the qualification itself that could affect security returns were controlled by using a matched sample. Firms were matched by

<sup>12</sup>See Accounting Trends and Techniques where each year, the proportion of firms that received a ST opinion is small compared to firms that received other types of qualifications.

<sup>13</sup> Except that my analysis is based on prediction while theirs is based on actual bankruptcies.

<sup>14</sup>See chapter 4.

industry, the year each of the sample firms received ST opinion and had the closest change in unexpected earnings. The measure used for unexpected earnings is that of Beaver. 11979). The unexpected earnings is the standardized and forecast error (ESIT) defined as ESIT=AEPS-AEPS/6(AEPS) ΔEPS=year-to-year change in EPS (earnings per share) in the event year, ΛΕΡS=average change in EPS during prior years 6(ΔEPS)=estimated standard deviation of the changes in EPS. 15 Elliot chose the date of disclosure of the ST qualification as the date the Wall Street Journal (WSJ) released the earnings of the firm in question. 16 This was done as information about qualified opinion receives uneven distribution, depending on whether a particular case appears newsworthy to the news Explicit reference was made to the qualified opinion in WSJ in only 14 of the 145 firms that he checked. There were only two cases in which the announcement of the qualified opinion accompanied the earnings release. The cumulative were then calculated for the samples using the (CAR) market model. The t-test was used to determine if the residuals of the two samples were significantly different. With respect to going concern and asset realization qualifications,

<sup>15</sup>The average and standard deviations were based on the prior 10 years of earnings if available. ESIT was calculated for all Compustat firms before they were matched.

<sup>160</sup>bserve that the choice of event date is the direct opposite of Firth (1978).

significant17 market response prior to the issue of qualifications but not on or after that date. No market reaction was found for qualifications with respect to pending litigation. interpreted his He result as . suggesting that certain uncertainties have economic significance. but market participants learn of them and assess their implications the auditor's opinion is available. His result also suggests that the litigation qualifications are associated with less substantial economic events than either going-concern or asset realization qualifications, Perhaps rightly. Elliot suggested that his paper did not resolve the question of the information content of ST opinions. This was because he found that he could not determine the actual event date when the ST opinions were first disclosed. 18 He, however, concluded that since ST opinions receive little attention from the financial press, it implies that they are of modest information value.19

<sup>17</sup>At the 0.01 level.

<sup>18</sup> Observe that the event date used by Elliot was correct only in 2 cases out of 145 firms, or less than 1.4%.

<sup>19</sup>This argument may be a tautology and it assumes the financial press knows what is useful or relevant information.

#### Survey Studies

Fess and Ziegler (1977):

Their survey covered 118 responses from financial analysts, 214 from bankers and 188 from individual shareholders. They asked two questions concerning readership of the auditor's report and one question concerning understanding of it. The questions and answers were as follows:

TABLE 2

# READERSHIP AND UNDERSTANDING OF THE AUDITOR'S REPORT.

(a) "How often do you look for the auditor's report when examining the annual report of corporations?"

| Financial Analysts | Bankers |Shareholders Alva vs 55.1% 87.4% 40.4% Often 23.7 7.5 22.9 Sometimes 16.1 3.7 21.8 Almost Never 5.1 1.4 14.9

- (b) "How carefully do you read the auditor's report?"

  Carefully | 28.0% | 69.2% | 27.3% |

  Hurriedly | 70.3 | 30.8 | 56.9 |

  Note that it | 1.7 | 0.0 | 15.8 |

  is there
- (c) "How well do you believe you understand the auditor's report?"

  Completely | 41.9% | 49.3% | 33.3% Most of it | 53.0 | 49.3 | 52.0

Most of it | 53.0 | 49.3 | 52.0 Much of it | 4.3 | 1.4 | 12.6 Do not | 0.8 | 0.0 | 2.1 understand it |

It is difficult to interpret the above results and one must depend on prior belief and expections. The only clear conclusion is that the respondents do look at or look for the auditor's report.

Shank, Dillard and Murdock (1978 and 1979);

Shank, Dillard and Bylinski (1979):

In these three studies, the same approach was used except that

the people surveyed differ in each case. The three studies together produced 304 responses from bank loan officers, 207 from chartered financial analysts and 307 from corporate financial officers.

A questionnaire with 8 contingency situations taken from actual annual reports was mailed to the participants. They were provided with 5 options for disclosing the contingency. These were:

- 1. no reference.
- 2. disclosure in the unaudited section of the annual report,
- 3. footnote disclosure,
- 4. footnote disclosure plus a three-paragraph ST audit opinion, and
- 5. disclaimer.

Among other things, the respondents were asked to state their preferred disclosure and to indicate the how contingencies should be disclosed. The results of these are in Table 3. They interpreted the result as indicating that ST opinions provide useful information and hence are valuable extensions of the auditor's attest function. However, they noted that the respondents in their survey do not understand the way auditors handle contingency situation. They argued that this confusion among users of financial statement does not the elimination of ST opinions. Instead, they argued for a program to educate financial statement readers.

# TABLE 3

### PREFERRED DISCLOSURE FOR SEVERAL CONTINGENCIES.

Preferred Disclosure: Percentage of responses specifying a qualified opinion or disclaimer of opinion should be used.

	Bank Loan  Officers		Financ		Corp.Finan.		
Cases	Qual. D  Opin.		Qual.    Opin.		Qual.	Discl.	
Asset Realization Litigation Going Concern Less Severe	153.9 1	26.0 25.3	48.1%   53.6    59.5    42.2	21.9 22.7	44.0%   68.0    73.0	N.A.	

A comparison of how disclosure should be provided from the respondents with the actual disclosure used in the annual report provided the following results.

Respondent		ank Loan fficers				rp.Finan. ficers
preferred a higher level of disclosure	1	46.2%	l	40.1%	1	31.5%
choice agreed with actual level		39.3	i	44.2	İ	48.1
preferred a lower level of disclosure	i	14.4	1	15.7	İ	20.4

Estes (1982):

given the financial statements of a hypothetical financial statements, they were company. For each of the provided with either no auditor's opinion, a standard or various forms of nonstandard audit-report. The audit qualifications when provided relate to a pending lawsuit. The subjects in this study a wide variety backgrounds: came from of institutional investors, analysts, shareholders and students totalling 1,359 respondents (about 41% of which are students). The survey method used is the Post-test-Only-Control-Group Experimental Design. It has the following form:

R X 01

R X 02

where R represents random assignment of subjects

X represents the experimental treatment

O represents the observation on the subjects.

Since responses by the subjects may not be due only to the stimulus in question, control variables were used. Estes uses a total of 14 control variables, such as age, business experience, years of college work, actual wealth invested in the different financial markets and so on.<sup>20</sup> The subjects were also asked to make decisions on the following:

- 1. Income projection for the firm
- 2. Share-price estimate

<sup>20</sup> See Elias (1972) and Hendricks (1976) who used similar control variables in their survey studies.

- 3. Company evaluation
- 4. Management evaluation
- 5. Investment decision
- 6. Confidence rating
- 7. Assessment of fraud

Multiple regression analysis Was used. The control variables along with a dummy variable denoting the audit form use d independent variables with the decision as the variables as the dependent variables. He found that the audit report has little effect on investor decisions and attitudes. The results were also not significantly different for the various forms of nonstandard audit reports. His finding, that the audit report has little effect on investor decisions, may not be of much interest in this study as this thesis addresses going-concern qualification. His other findings that different forms of nonstandard audit opinions have no significant effect on investor's decisions should be of much interest. This will be elaborated later in this chapter.

#### Predictive Ability of ST opinion studies

Altman and McGough (1974) and

Altman (1982)

The same approach was used in both of these studies. In Altman and McGough's paper, 34 companies that entered bankruptcy proceedings during 1970-1973 were used, while 37 companies that failed during 1974-1978 and 44 companies that went bankrupt

during 1979-1982 were used in Altman's study. The annual reports for the two years prior to the date of bankruptcy were examined to determine the nature of the auditors' opinions. The predictions using the ST opinions, that is, whether or not the company received a ST opinion, were then compared to the predictions using a MDA model. The results are presented in Table 4.

#### General Comments

In order to address the policy issue as to whether the ST opinions should be eliminated, one must come up with some general propositions that are reasonable and generally accepted by researchers in this area. 21 Otherwise, it would be like ten blind men describing various parts of an elephant. No conclusion can ever be achieved. I believe the framework for analysis regarding elimination of ST opinions has been set by the Cohen Commission. Their reasons for elimination of ST opinions should addressed by any study that prescribe a rejection or acceptance of the Commission's conclusion. The studies cited earlier have not done this. They have neither put forward general propositions nor have they systematically tested the reasons of the Commission. The contribution of the studies to date is more in their methodology than in their results. studies have refined the various research methods, and may shed some light on the most appropriate method for each situation. It 21Short of coming up with a social welfare function.

TABLE 4
========

COMPARISON OF THE MDA MODEL TO THE AUDITORS OPINIONS.

	1 year pi   Bankrupto		2 years prior to Bankruptcy		
Samples	Number of Firms	<b>%</b>	Number of Firms	*	
1970-1973 sample: Predicted Bankrupt ST opinion Total	23 1 23 1 13 28		19 19 17 1 33	57.6 21.2	
1974-1978 sample: Predicted Bankrupt ST opinion Total	30 22 37	   81.1   59.5 	27   27   5   37	73.0   73.5   13.5	
1979-1982 sample: Predicted Bankrupt* ST opinion Total	41 1 47 1 44	93.0 40.0	34 9 43	76.0 21.0	

<sup>\*</sup>it is not clear if ex-ante prediction was used in this case.

is also clear from those studies that all uncertainty qualifications should not be treated in the same way. Rather it is necessary to test them separately.

There is no reason why the use of the MBAR method should preclude the use of survey techniques or vice-versa. In fact, the two should be used as complements, as each of these methods is most appropriate in different situations.

The problems of using the MBAR method are as follows:

- 1. The date of impact is difficult to identify.
- 2. It is restricted to analysis of aggregate data.
- 3. Only a limited number of opinion forms are generally released. As such, some forms are issued too infrequently to provide an adequate basis for statistical analysis.
- 4. It cannot study the differential effect of an audit and the auditor's standard opinion on users of financial statements.

  To do this, a control group of unaudited statements would be needed. Yet all listed companies must produce audited statements.
- 5. The observation of a market reaction could be due to other information that occurs at about the same point in time. The converse is also true. If no market reaction is observed, it does not necessarily mean that the event in question has no information content. An event which causes the market to react in the opposite direction may occur at about the same period.

Likewise, the survey techniques are not without problems.

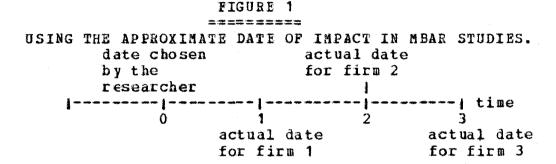
The main ones are:

- The difficulty in securing a respectable number of respondents.
- 2. The lack of real economic incentives and
- 3. One can never know with any degree of certainty whether the observed behaviour is a result of the experimental treatment or other factors. Estes (1982) and Elias (1972) tried to control for these "other factors", but there are innumerable possible "other factors" to account for.

The MBAR studies to date have failed to isolate the information content of the ST opinion from the aggregate financial statement, as correctly pointed out by Bailey (1982). Using only earnings as a control is clearly not appropriate. are dealing with the possibility of insolvency, and not profitability. 22 The research method proposed and used in this thesis has, for the first time, makes a real attempt to overcome the above problem. The proposed method does not, however, overcome all problems with MBAR studies. It is almost impossible to study the effects of different forms of nonstandard audit reports on investment decisions using the MBAR method. Here is where a survey technique like that of Estes should be used. On the other hand, the usefulness or information content of ST opinions can be judged only by looking at the real decisions

<sup>22</sup> I realise profitability affects solvency in the long-run but they are not the same in the short-run.

taken by the users of financial statements, and this almost impossible task for survey techniques. Even the MBAR method could not study individual users' reactions. Finally, there is the problem with identifying the date of impact in MBAR studies. This problem is however not an impossible one handle. All we need to know is the approximate date of impact. An example could perhaps best illustrate this point.



Firms 1 to 3 make up the experimental sample. For simplicity, let's assume that the actual impact causes a -0.2 residuals on the day of impact

a 0.0 residuals prior to and subsequent to the above

a -0.1 residuals on the day after the impact and

mentioned days.

What would our average and cumulative average residuals be?

DAY	AVERAGE RESIDUALS	CUMULATIVE AVERAGE RESIDUALS	
-1	0.0	0.0	1
0	0.0	0.0	
1 .	-0.067	-0.067	
2	-0.1	-0.167	
3	-0.1	-0.267	
4	-0.033	-0.3	
- 5	0.0	-0.3	
6	0.0	-0.3	

Is the above result statistically significant? The answer surely depends on the time period we chose to use (which of course depends on how well we can approximate the actual date). In this example, we approximated the date of impact at t=0. The result clearly significant at x=0.025.23 Note that in this example, the "predicted" date of impact is incorrect for all cases. However, the results are statistically significant, as would be expected if we knew the exact date of impact. This example also illustrates another important point in MBAR studies. By looking at the results above, one would likely interpret that the market a lag in response to the event in question. The market has response begins at either t=1 or t=2 when the "predicted" date is t=0. Also, the market appears to take 3 or 4 days to fully adjust to this new information. Conclusions such as that above are clearly not warranted unless the researcher can fully demonstrate that the correct date of impact has been identified. This is impossible in most research. Bear in mind that the impact date need not be the day certain users receive that

<sup>23</sup>Where the observations t=0 to t=4 are used. It has a mean of -0.06 and a standard deviation of 0.0435. The t value is -3.0848 with 4 degrees of freedom.

information in the mail. They may take two days to open their mail. Short of identifying the exact date, the results should be interpreted as an indication of the direction of market response, if any, around the researcher's "predicted" date of impact.

#### Prediction versus Classification

Classification or ex-post discrimination in MDA refers to cross validation. Prediction means to foretell the future. This can be illustrated as follows:

## FIGURE 2

PREDICTION VERSUS CLASSIFICATION.
PAST FUTURE

|-----| time

t=0

Models are built in this period using expost data. The relevant variables and their coefficients are established. A different sample from this period could be used to determine the classification accuracy of the models.

at t=0 (now), the researcher can use the models already created at t<0 to predict the future, t>0. Keep in mind that at t=0, the dependent variable (the event being predicted) is not yet known. Only the independent variables are known at t=0. Comparing the prediction at t=0 with actual events at t>0 gives the predictive accuracy of the models.

Past studies using MDA models have not recognized this point. An example is Altman's 1968 study. Using a sample of firms (sample A1) from 1946-1965, a discriminant function was estimated. A new sample of firms (sample A2) obtained from the same period, 1946-1965, was used to cross validate. Altman concluded that he had successfully predicted bankruptcy based on

the cross validation results.

An immediate question that comes to mind is, how can predictive accuracy ever be known except in the future? The approach used in this thesis is to make use of a research time frame. 24 This will be discussed in Chapter 3. A point to note is when "prediction" is used in this thesis, it always refers to ex-ante prediction using the MDA model and "classification" refers to ex-post discrimination or cross validation. For convenience, the notation P(B) is used to refer to ex-ante prediction of bankruptcy using the MDA model and P(NB) refers to ex-ante prediction of non-bankruptcy.

#### Prediction of Bankruptcies using MDA studies

The study by Altman (1968) pioneered the used of MDA in solvency evaluation. Beginning with a total of 22 financial ratios, 5 of these were selected as doing the best overall job in the ex-post validation of bankruptcies. These ratios, together with the classification accuracy of the model are shown in Table 5. Never and Pifer (1970) introduced financial data from more than one period prior to failure by regressing each financial ratio on time and determining the trend and shift away from the trend in the period prior to failure. Although the Meyer and Pifer model was more complex, it performed worse in ex-post classification of bankruptcies than Altman's simpler

<sup>24</sup>See McDonald (1977) for a discussion of prediction in research time.

# TABLE 5

```
A SUMMARY OF PAST STUDIES THAT USES MDA MODELS.
Fraction of sample that is misclassified:
            1Study
            1=====
Years before | Altman | Deakin | Sinkey | Altman |
 Failure | (1968) | (1972) | (1975) | (1977) |
    1
            1 0. 16 | 0. 22 | 0. 25 | 0. 09 |
    3
            1 0.52 | 0.12 | 0.35 | 0.18 |
    5
            1 0.64 | 0.15 | n.a. | 0.2
sample size I
             66
                      64
                          1 110
                                  1 111
The misclassification error is for the holdout sample.
Ratios used in the studies above:
Beaver : Cash flow/TD
        : FBIT/TA, Sales/TA, Stock/TD, RE/TA, WC/TA.
Altman
Deakin
        : WC/TA, CA/CL, TD/TA, QA/Sales, QA/TA, Cash/TA,
        : Cash/TA, CA/TA, Cash/CL, NI/TA, CA/Sales, Cash flow/TD.
        :Other expenses as %R, Loan as %R, OE/Operating
Sinkey
        :income, Loans/(capital+reserve), state and local
        :obligations as %R, (cash+U.S. treasury securities) /
        :TA, Loans/TA, Provision for loan losses/OE, U.S.
        treasury securities as %R, interest paid on
        :deposit as %R.
Altman : RE/TA, Standard deviation of EBIT/TA around a ten
et al. : year trend, Stock/TC, CA/CL, log of TA, EBIT/TA,
        :log of EBIT/Total interest payments.
CA
       =current assets
CL
       =current liabilities
EBIT
       =earnings before interest and taxes
NI
       =net income
OE
       =operating expenses
OA
       =quick assets
as %R =as a % of revenue
RE
       =retained earnings
Stock =total market value of common stock in Altman
       et.all and common plus preferred stock in Altman
TA
       =total assets
TC
       =total capital
TD
       =total debt
WC
       =working capital
```

model when tested on the same data set by Collins (1980). MDA model to classify small Edmister (1972) used a linear business failure, and he introduced industrial classification and trends in financial ratios as discriminating variables. is difficult to determine the success of the model since his use of dummy variables as the descriptive variables clearly violates the multivariate normality assumption [Ohlson, 1980, p.112], and the hypothesis that the variance-covariance matrix are the same the two groups will most likely always be rejected for [Eisenbeis, 1977, p.881]. The effect of this violation may bias test of significance and the estimated error rates the [Eisenbeis, 1977]. The predictive ability of his model unclear as no ex-ante predictions of bankruptcy were made in his paper.

Moyer (1977) compared Altman's 1968 model with an alternative MDA model which uses Beaver's (1968) cash flow/total debt and Lev's (1971, 1974) balance sheet decomposition measure. He found that Altman's model outperforms his alternative MDA model in classification accuracy. However, he also found that better explanatory power could be achieved if two of the variables, namely market value of equity/book value of debt and sales/total assets were eliminated from Altman's model. Altman et al. (1977) using a number of different variables from Altman's original study, found their new model outperforms Altman's original in terms of expected cost criteria using prior probabilities of group membership and expected cost of error

estimates derived from commercial bank lending errors. That is, it takes into account the fact that only a small percentage of all firms actually fail and the cost of Type I (bankrupt firms predicted to be solvent) and Type II errors (solvent firms predicted bankrupt) are not equal. This comparison was again based on ex-post classification accuracy. 25 Finally, Dambolena and Khoury (1980) found that variability or standard deviations are important descriptive variables in their ex-post classification of bankrupt and non-bankrupt firms.

Among the most important criticisms of the studies above is that of Joy and Tollefson (1975), who argued that most of the studies dc not perform ex-ante validation. Johnson (1970) also pointed to the fact that the models are static while bankruptcy is dynamic in nature. 26 General criticisms of the application of MDA and the effects of violating its assumptions are Eisenbeis (1977) and Richardson Davidson discussed in and attempt to overcome the This study will criticisms, in part, by using ex-ante prediction in research time, as stated above. Other steps taken to overcome the above criticisms include testing for the equality of the variance-covariance matrices, before a linear MDA model is used.

<sup>25</sup>Comparison was also made by Altman et al. using a mixture of predictive and classification accuracy. As this does not really make sense, it is ignored in this thesis.

<sup>26</sup>It is argued in this thesis that the use of variances and trends of financial ratios is dynamic in a sense. For inter-temporal models, see Tinsley (1970), Wilcox (1971, 1973) Santemero and Vinso (1977), Vinso (1979) and Scott (1976, 1977, 1981).

Although the model continues to be static in nature, the variance of (net income/total asset) is used as a dynamic component. Furthermore, inter-temporal models have so far proven to be less effective than static models. Finally, Ohlson (1982) complained that some researchers have used data subsequent to a firm filing Chapter X or Chapter XI of the Bankruptcy Act. This causes a bias in their results. The daily returns data from CRSP were used in this thesis to check for delisting of the sampled firms, which avoids using data for firms after they have technically failed.

#### Brief Summary

From the survey of the literature in this Chapter, the following seems to have been established:

- 1. The market response to the different types of qualifications differs significantly. The greatest response, if any, is with respect to going-concern reservations in the audit opinions.
- 2. The predictions of MDA models outperform those of ST opinions in predicting solvency.
- 3. The MDA model has been successful in ex-post classification and ex-ante prediction<sup>27</sup> of business failures. It, therefore, appears to be an effective method of using information from the financial statements to predict

<sup>27</sup>Although it is true that few studies so far have performed ex-ante predictions.

solvency of companies.

The information content of ST opinions is uncertain. Contradictory evidence has been reported, irrespective of whether the MBAR or the survey technique was used. This could, in part, be due to the use of inappropriate research designs.

Finally, the self-fulfilling prophecy of issuing a ST opinion seems never to have been tested. It had been mentioned, even assumed to exist, in some studies [example, Altman (1983) and Cohen Commission (1977-1978)] and implied not to be present by others [example, Libby (1979) and Estes and Reimer (1977)] but it has not yet been explicitly tested.

The contribution of this thesis is mainly in two areas. Firstly, it represents the first real attempt to study the information content of ST opinions in isolation from the information in the financial statements, the methodological failure of past studies using the MBAR approach. Secondly, a clarification is also made on the methodological issue of ex-post classification and ex-ante prediction. A simple statistical test is also performed on the validity of the self-fulfilling prophecy.

#### III. Research Design

This chapter discusses the sampling procedure and the research method employed in this thesis. When necessary, the justification for using a particular analysis will be discussed.

#### The sample

An initial sample of 46 firms which met the following criteria was obtained from the Compustat Annual Research tapes:
The firms were all

- listed as liquidated,
- 2. classified as a manufacturing firm,
- issued their last financial statement from 1971 to 1980,
   and
- 4. listed in the New York Stock Exchange (NYSE) or the American Stock Exchange (AMEX) before liquadation. 29

These firms were then cross-checked with the Centre for Research in Security Prices (CRSP) tapes which indicated that the daily security return data for 3 of the firms in the sample were not available. This was followed by selecting a matched sample of 43 non-bankrupt firms, obtained from the Compustat Annual

<sup>28</sup> The firms actually went bankrupt from 1972 to early 1983. This period was used in order to have sufficient observations to calculate the variance of certain financial ratios, noting that Compustat only provide 20 years of annual data.

<sup>29</sup>The Compustat research tape have data only for firms that were listed in these exchanges before they liquidate.

Industrial Tape. 30 The matching was performed in the following manner:

- 1. The firms are all manufacturing firms.
- 2. Individual firms were matched up to the 4 digit Standard Industrial Classification (SIC) code whenever possible.
- Within the same industrial classification, firms were randomly selected.<sup>31</sup>
- 4. The firms must also be listed on the NYSE or the AMEX and daily security return data must be available in the CRSP tapes.
- 5. Once the matched firm has been found, the data used were for the same year as that for the failed firm.

A point that should be emphasized is that firms were not matched by asset size, as this might turn out to be an important predictor of business failures as observed by Altman et al. (1977) and Ohlson (1980). 32

<sup>30</sup> See Appendix A for the firms in the two samples.

<sup>&</sup>lt;sup>31</sup>One assumption of using sample data with discriminant analysis (MDA) is that each group is drawn at random from independent samples [Deakin, 1972, p.172].

<sup>32</sup>That is, asset size may be a significant factor for predicting business failures and may therefore be used as an independent variable.

#### The Statistical Method

Multiple discriminant analysis (MDA) is a statistical technique 33 and is introduced in this thesis as a control for the information content of financial statements. MDA does not use a single figure from the financial statements, but instead uses a combination of figures (more precisely, financial ratios) that could discriminate between firms that are going concerns and those potentially insolvent. It uses not just profitability, but also the leverage, liquidity and activity ratios. In other words, an entire profile of characteristics common to the sample firms, as well as the interaction of these characteristics, is taken into account. By using the predictions model to control for the information content of this financial statements, the market response to firms that receive ST opinion but P(NB) can be used as an indication of the information content of the ST opinion, isolated from the information content of the financial statements. The assumptions of MDA are as follows: [Eisenbeis and Avery, 1972]

- 1. The groups under investigation (bankrupt and non-bankrupt firms) are discrete and identifiable.
- 2. Any observation in any group is susceptible to description by a combined set of measurements of several variables.
- 3. These descriptive variables have multivariate normal distributions in each population.

To use a linear MDA model, an additional assumption is that the 33See Appendix H for the theory of MDA.

population dispersion matrices be equal. The Box-M test will be used to test the hypothesis of equal dispersion matrices (variance-covariance matrices). If this hypothesis is rejected and the sample size is large, a guadratic rule should be used [Eisenbeis and Avery (1972) and Eisenbeis (1977)].

Although the use of financial ratios will most likely violate the multivariate normality assumption, [Eisenbeis, 1977, p.877], Gilbert (1968) found that there is only a small loss in predictive accuracy.<sup>34</sup>

#### Footnotes Disclosure

An important point stated in chapter 1 that should be elaborated, is the inclusion of footnote information as part of the analysis of financial statements, and not as a separate category. An immediate question arises, does the market respond differently for firms that receive a ST opinion and some or all of the reasons stated in the footnotes, as compared to a firm where only a ST opinion is issued without the footnotes disclosure, or as compared to a firm that did not receive a ST opinion but with similar information disclosed in the footnotes? In other words, if the information is already stated in the footnotes to the financial statements, is there any additional

<sup>3.4</sup> One could take logarithms to transform the variables, but this restricts one to the use of positive values only. Furthermore, logarithmic transformations may change the interrelationships among the variables, and give less weight to equal percentage changes in a variable when the values are larger than when they are smaller [Eisenbeis, 1977].

information content by issuing a ST opinion? A going-concern qualification is not issued for a single factor or a few factors independent of each other (as is the case for litigation qualification for example) but rather, it is issued for a combination of these factors. Factors that tend to contradict the going concern assumption (that is, factors that could cause a going concern qualification) and those that mitigate these factors are stated in the Statement on Auditing Standards Number 34. It is the evaluation and trade-offs of all these factors that are relevant for the auditor in his decision to issue a ST opinion. Thus, the disclosure of some of these in the footnotes is but one piece of relevant information. This information in itself, such as current loss, is cause for believing that a firm will become net no bankrupt. Of course it is possible that if all the reasons used by the auditors are stated in the footnotes, it may make the ST opinion by itself irrelevant. Also, note that ST opinions sometimes given without any reference to a footnote, that is, none of the reasons are disclosed in the footnotes the financial statements. This study does not control footnote information itself, believing that much of information, like ability to pay interest, is well captured by the MDA Model used in this study. It is also believed that there is a difference in the degree of uncertainty, at least as perceived by that particular auditor, when a ST opinion is issued rather than just disclosing the factors in the footnotes.

is some evidence in this thesis that the financial market may react differently to the different forms of disclosure. 4, the results indicate that the market reacts only in portfolios where the firms were issued a ST opinion. No market reaction was observed for firms that were P(B) and had no ST opinions, even for those firms that actually went (Portfolio 3A). It is reasonable to assume that many of these firms in Fortfolio 3A may receive some footnote disclosures the possibility of the firm not being able to meet its obligations, or that the assets do not reflect realizable value because of going-concern uncertainties. A tentative conclusion can, therefore, be reached that the market may react differently to the different forms of disclosure. This is likely due to the fact that they are perceived to reflect different degrees of uncertainty. 35

#### Building a bankruptcy prediction model

Keeping in mind the difference between ex-post classification and ex-ante prediction discussed in last chapter, the model used in this thesis is a prediction model. Past observations of the independent and dependent variables are

<sup>35</sup>It is unfortunate that such a test could not be carried out by identifying exactly the firms that received the equivalent or almost equivalent footnote disclosures for the going-concern uncertainties, as the entire financial statements of these firms are not readily available. Only the auditor's reports for each of the firms in the sample were photocopied, from the Public Reference Room of the Securities and Exchange Commission at Washington D.C.

first used to create a prediction model. The researcher is then placed at research time t=0 (where t=0 is subsequent to the time period where the model was built). At t=0, the independent variables of some firms are observed. Say for example, Firm A's financial statements became publicly available at December 31. 1975 (t=0). At this point, the researcher predicts the dependent variable (that is, P(B) or P(NB)) using the model created. The actual outcome of the dependent variable is of course not known at December 31, 1975. The actual time for the researcher could be May, 1984 but this is no longer relevant. Only subsequent to t=0 (Dec. 1975 in this case) will the dependent variable be known. Otherwise, the model will not be a prediction model. This is shown in Table 6 below:

INDEPENDENT VARIABLES	DEPENDENT VARIABL	E OBSERVED AT	
OBSERVED AT	t<0	t>0	
t<0	Classification Model	Predictive Model	
t>0	NULL	Classification Model	

If the researcher is at actual time May 1984, he would know the outcome of the dependent variable given the benefit of hindsight. The predictive accuracy of the model can, therefore, be determined. It is still a predictive model given that the predictions were made at t=0 based on only the information that was available at that point in time. The above is duplicated over and over again for each firm by simply shifting the

research time t=0 forward. This is illustrated below:

FIGURE 3
========
AN ILLUSTRATION ON THE USE OF RESEARCH TIME.

Financial Statement of Firm B is known at t=02 PAST t=0t=02today |----| time t=01t=0.3Both indep. Financial Firm A and depen. Statement actually variables of Firm A went for some is known bankrupt. firms are known and model is created.

At t=01, the independent variables for Firm A are known. prediction is made at this point to predict the dependent variable of Firm A which is as yet unknown. The information used is the information provided at t=01 and all past information. The model used is the model created before t=01, that is, the variables plus the coefficients of the model must already be estimated before t=01, and the information at t=01 cannot used to update the model to predict Firm A. The information at t=01 can, however, be used to update the model but, only to predict the dependent variable subsequent to t=01. Following the rationale above, a prediction of the dependent variable of Firm is made at t=02. That is, the researcher is now at t=02. At t=03, the actual outcome of the dependent variable for Firm A is known and a comparison can be made with the prediction at t=01. Given our hindsight in actual time, we know that Firm B did not

fail and a similar comparison is made with the prediction at t=02. Thus, the predictive accuracy, in an ex-ante sense, of a model can be determined.

A total of sixteen descriptive variables, found relevant in past studies, were formed from the financial statements data for each firm. They are listed in Appendix B. From the total sample of 86 firms, 22 were used for analysis (those firms that published their last financial statement during the period 1971 to 1973 and their matched pair) and 64 used for prediction (those firms that published their last financial statement during the period 1974 to 1980 and their matched pair). This is as shown below:

# FIGURE 4

A SUMMARY OF THE ANALYSIS AND PREDICTION STAGE.

Jan.	ANALYSIS	June	PREDICTION	Dec.	
1971	STAG E	1974	STAGE	1983	Real
1		1			Time
		t=0			

11 firms that failed during Jan. 1971 to June 1974 and their matched pair were used in the analysis stage to build the model. Both the independent and the dependent variables are known.

32 firms that failed during July 1974 to Dec. 1983 and their matched pair were used in the prediction stage. Once the model was built at t=0, t=0 is then moved forward to the time when the financial statements of these 64 firms are available. Once the statements are available, a prediction is made. Information subsequent to that date is not used in the prediction.

To summarize, the discriminant function 36 built in the analysis stage is applied to the prediction sample.

<sup>36</sup>There is only one function since I have only two groups: solvent and insolvent firms.

#### Analysis Stage

The Statistical Packages for the Social Sciences computing program was used to perform the discriminant analysis. The Wilks' step-wise method was initiated to reduce the descriptive variables. This is necessary since accounting of ratios are expected to be multicollinear, as they come from a common set of financial accounts [Edmister, 1972]. The effect of applying highly multicollinear independent variables generally results in parameter estimates that are markedly sensitive to changes in model specification and sample coverage. Forecasting successfully with multicollinear variables requires not only the perpetuation of a stable dependency relationship between dependent and the independent variables but also perpetuation of a stable interdependency relationship within the independent variables [Farrar and Glauber, 1967]. The criterion is therefore to select a set of variables that minimizes the and X test overall Wilks lambda (which is an F is to significance of group mean differences). The effect maximize the separation of the groups.

The results of the Box-M test support the hypothesis that the variance-covariance matrices of the two groups are not significantly different 37 and therefore, a linear MDA model will be used. Using the 22 cases, the following variables were

<sup>37</sup>At the 0.01 significant level.

found to be relevant: (i) Quick Ratio, which is a measure of the firm's liquidity, (ii) Debt-Equity Ratio, which is a measure of the firm's leverage, (iii) Net Income to Total Debt, which is a measure of the firm's profitability, and (iv) Total Assets which is use to measure the firm's size. The precise specification is given in Appendix B. The unstandardized and the standardized discriminant function coefficients and the group centroids (that is, the discriminant function evaluated at the group means) are given in Table 7.

TABLE 7
=======
DISCRIMIN ANT FUNCTION COEFFICIENTS:

VARIABLES	STANDARDIZED	UNSTANDARDIZED	EXPECTED SIGNS	
1. Quick Ratio 2.TD/TA 3.NI/TD 4.T.A. Constant	0.35496  -0.54843   0.48133   0.41870   N.A.	0.8594176 -3.572309 1.533873 0.002404785 0.4651458	(+) (-) (+) (+) (+)	
GROUP CENTROIDS: Group 1 (Bankrupt firms) -1.48730				

1.48730

where

TD/TA = Total Debt to Total Assets

(Solvent firms)

NI/TD = Net Income to Total Debt

TA = Total Assets

See Appendix B for a precise specification of these ratios.

The coefficients of the function all have the expected signs. Greater liquidity implies less risk while greater leverage has the opposite effect on risk. Higher profitability helps the firm to keep solvent, especially in the long run. Finally, firms that are large face less risk of becoming insolvent. Governments and banks are more reluctant to let such a firm fail (Chrysler is a perfect example) for political reasons as well as the amount of

loans that have already been made. As such, they usually have more avenues to raise capital, and historically, fewer of them failed.

#### Prediction Stage

Table 8 presents the accuracy of the model using the last. second last and third last financial statements before failure as well as the Type I and Type II errors in each The results do not explicitly incorporate the cost of Type I and Type II errors and assume equal probability of failure and non-failure for firms. One could correct for this by setting a new cut-off discriminant score which separate the two groups taking into account the differential cost of Type I and Type II errors as well as incorporating prior probabilities of failure or non-failure rates. This new cut-off score or Z38 is log (P1) (C1) / (P2) (C2) where P1 and P2 are the equal to probabilities that a firm belong to group 1 (bankrupt) or group 2 (non-bankrupt) respectively. C1 is the explicit cost of Type I error or investing in (lending to) a firm that went bankrupt and C2 is the cost of Type II error or cost to the investor (lender) of predicting that a firm will go bankrupt when it remains solvent. The variables P1, P2, C1 and C2 will be different depending on the time, the industry being considered, individual tastes and preferences and on. Following Altman et al. so

<sup>38</sup>See Appendix H for further explanation and mathematical proof.

TABLE 8

#### THE RESULTS OF THE PREDICTION:

(A) USING THE	LAST FINANCIAL	STATEMENT BEFORE	FAILURE.
ACTUAL GROUPS	NO. OF CASES	PREDICTED GROUD BANKRUPT	P MEMBERSHIP NON-BANKRUPT
Bankrupt	32	27 (84.4%)	5 (15.6%)
Non-Bankrupt	32	4 (12.5%)	28 (87.5%)
Percent of case	es predicted co	orrectly:85.95%	· I
(B) USING THE	SECOND LAST FI	NANCIAL STATEMENT	BEFORE FAILURE.*
ACTUAL GROUPS	NO. OF CASES	PREDICTED GROUP BANKRUPT	•
Bankrupt	25	18 (72.0%)	7 (28.0%)
Non-Bankrupt	26	0 (0.0%)	26 (100%)
Percent of case	es predicted co	orrectly:86.27%	
(C) USING THE	THIRD LAST FIN	ANCIAL STATEMENT	BEFORE FAILURE.*
ACTUAL GROUPS	NO. OF CASES	PREDICTED GROUP BANKRUPT	MEMBERSHIP NON-BANKRUPT
Bankrupt	22	12 (54.55%)	10 (45.45%)
Non-Bankrupt	24	0 (0.0%)	24 (100%)
Percent of cases predicted correctly:78.26%			

<sup>\*</sup>The number of total firms is less than in (A) because 13 of the firms issued their 2nd last financial statements during 1973 and 18 firms issued their 3rd last financial statements during 1972.

(1977), we use estimates of P1=0.02 and P2=0.98. Altman et al. estimated that C1=0.7 and C2=0.02 for commercial banks. For individual investors, C1 is expected to be greater than 0.7, and since C2 is the opportunity cost of not investing in the firm that was predicted to go bankrupt but did not, C2 could be as low as zero if as profitable a return could be obtained from other investments. Since it is generally believed that higher risk investment generates a higher return. C2 equal to a positive value of 0.01 appears reasonable. A rough guess of C1=0.9 for individual investors is made. The associated Z value 0.264. Firms with a discriminant score of less than 0.264 will now be classified as bankrupt. Table 9 shows the results of using this new rule. A consequence of using this new rule is that Type I errors are reduced, since a higher cost has been attached to it. There is also a slight overall improvement compared to the results in Table 8, but as indicated above, there is no reason to choose one Z score over another. The reason for using the above analysis is to show that personal tastes, preferences and so on could also be built into the model if desired.

We feel the accuracy of this MDA model justifies the use of its prediction to control for the information content of financial statements.

## TABLE 9

THE RESULTS OF THE PREDICTION: USING A NEW CRITERION. i.e. using explicit cost of error estimates and different probabilities of prior group membership. Z=0.264

	or brior 3200b	membership. Z-(		
(A) USING THE	LAST FINANCIAL	STATEMENT BEFORE	FAILURE.	
ACTUAL GROUPS	NO. OF CASES	PREDICTED GROUI BANKRUPT	MEMBERSHIP NON-BANKRUPT	
Bankrupt	32	29 (90.63%)	3 (9.37%)	
Non-Bankrupt	32	5 (15.63%)	27 (84.37%)	
Percent of case	es predicted co	orrectly:87.50%	1	
(B) USING THE	SECOND LAST FIR	NANCIAL STATEMENT	BEFORE FAILURE.	
ACTUAL GROUPS	NO. OF CASES	PREDICTED GROUP BANKRUPT	•	
Bankrupt	25	19 (76.0%)	6 (24.0%)	
Non-Bankrupt	26	(0.0%)	26 (100%)	
Percent of cases predicted correctly:88.23%				
(C) USING THE THIRD LAST FINANCIAL STATEMENT BEFORE FAILURE.				
ACTUAL GROUPS	NO. OF CASES	PREDICTED GROUP BANKRUPT	MEMBERSHIP   NON-BANKRUPT	
Bankrupt	22	14 (63.64%)	8 (36.36%)	
Non-Bankrupt	   24 	3 (12.5%)	21 (87.5%)	
Percent of cases predicted correctly:76.09%				

#### IV. The Empirical Results

The empirical results in this chapter relate to three of the six reasons given by the Cohen Commission in their proposal to eliminate ST opinions.<sup>39</sup> Evidence will be provided on:

- the predictive ability of ST opinions as compared to the MDA model used in Chapter 3,
- 2. the information content of ST opinions, and
- 3. the self-fulfilling prophecy of issuing a ST opinion.

The other reasons used by the Commission are firstly, not relevant given my propositions in Chapter 1, and secondly, the issue of legal protection for auditors is best addressed by the legal profession.

#### The Predictive Ability of ST opinions versus an MDA Model

The bypothesis addressed in this section is:

H1: ST opinions predict at least as well as an MDA model.

The predictive ability of the MDA model was presented in Table 8 (see Chapter 3). Table 10 shows the results using ST opinions. It is clear that the MDA model far outperforms ST opinions in predicting bankruptcy. Based on the last financial statement before failure, the MDA model has an overall accuracy of 85.95%, while accuracy is only 62.72% for ST opinions. The results are even more striking when comparing the Type I errors.

<sup>39</sup>Listed in Chapter 2.

TABLE 10
=======

PREDICTIVE ACCURACY OF SUBJECT-TO OPINIONS.

(A) USING THE LA	AST FINANCIAL	STATEMENT BEFORE	E FAILURE.
ACTUAL GROUPS IN	OF CASES		FIRMS WITH   NO ST OPINION
Bankrupt	28	11 (39.29%)	17 (60.71%)
Non-Bankrupt	31	5 (16.13%)	26 (83.87%)
Percent of cases	predicted co	orrectly:62.72%	· I
(B) USING THE SI	ECOND LAST FIR	NANCIAL STATEMENT	r BEFORE FAILURE.
ACTUAL GROUPS IN	O. OF CASES	FIRMS WITH ST OPINION	
Bankrupt	28	5 (17.86%)	23 (82.14%)
Non-Bankrupt	29	3 (10.34%)	26 (89.66%)
Percent of cases predicted correctly:54.39%			
(C) USING THE THE	HIRD LAST FINA	ANCIAL STATEMENT	BEFORE FAILURE.
ACTUAL GROUPS IN	NO. OF CASES	FIRMS WITH ST OPINION	FIRMS WITH NO ST OPINION
Bankrupt	25	4 (16.0%)	21 (84.0%)
Non-Bankrupt 1	26	3 (11.54%)	23 (88.46%)
Percent of cases predicted correctly:52.94%			

ST opinions have a Type I error of 60.71%, while it is only 15.6% for the MDA model. \*\* Our conclusion is that H1 is not supported.

#### The Information Content of ST Opinions

The hypothesis tested in this section is:

H2: The difference in average residuals (DAR) is zero for all portfolios. That is, there is no information content in ST opinions and/or the predictions of the MDA model.

The Sharpe-Lintner Market Model\*1 was used to determine the abnormal returns, if any, as a result of ST opinions and/or the predictions of the MDA model. A total of 230 daily security returns observations for each firm were obtained from the CRSP tapes. Day 31 was the date that appeared on the audit opinion\*2, and will be used in this thesis as the expected date of impact. As information about the ST opinions could have leaked into the financial market before this day, only returns from day -170 to day 0 were used to estimate the parameters of the model. Using the estimated value of the coefficients, the forecast returns are then compared to the actual daily returns for day 1 to day

<sup>60.</sup> This is shown below:

<sup>\*</sup>OTHE results above do not include firms that receive a ST opinion subsequent to the firm filing Chapter X or Chapter XI of the Bankruptcy Act, which frequently occurs.

<sup>41</sup> See Appendix G for the theory underlying this model.

<sup>\*2</sup>The auditor could in fact have signed the opinion prior to this date, but the date of release of the financial statements is always on or subsequent to this date.

# Date of impact

Once the residuals of each firm are obtained, they are formed into portfolios, depending on

- 1. the firm's actual status (bankrupt or non-bankrupt),
- 2. whether it received a ST opinion or did not, and
- 3. whether it was P(B) or P(NB).

The average residuals by portfolio are then subtracted from average residuals. \*3 This control portfolio's yields difference in average residuals (DAR) for each .of the portfolios (that is, portfolios other than the control groups). The results of the and the cumulative DAR DAR (CDAR) presented in Appendices C to F. Plot 1 to Plot 9 show the CDAR for the primary portfolios and the cumulative average residuals (CAR) for the control portfolios. Finally, Table 11 shows the significance of the market response in each portfolio using the t-test. The results are then summarized in Table 1A, Table 1B, and Table 1C.

<sup>\*3</sup>The control portfolios are Portfolio 4, portfolio 4A, Portfolio 4B, and Group 7 (the particular control group used depends on the specific situation, as will be obvious later). The portfolios are as defined in Chapter 1. Group 7 is the control portfolio for the six groups which are similar to the portfolios except that the definition of information is based on the change in auditor's opinion and/or model prediction. This is shown in Table 1C.

TABLE 11
=======
T-TEST FOR THE D.A.R. OF EACH OF THE PORTFOLIOS.

PORTFOLIOS OF FIRMS	prior to the date of	PERIOD=31-50 on and after the date of impact.	PERIOD=21-40 around the date of impact.	
Portfolio 1	t=.203878	t=-2.354796	t=612403	
		x<0.025 *	x>0.25	
Portfolio 2	t=723404	t=-1.030305	t=.470161	
	0.1 <k<0.25< td=""><td>0.1&lt;α&lt;0.25</td><td>x&gt;0.25</td></k<0.25<>	0.1<α<0.25	x>0.25	
portfolio 3	t=.221647	t=852766	t=.851011	
	k>0.25	0.1 <x<0.25< td=""><td>0.1&lt;&amp;&lt;0.25</td></x<0.25<>	0.1<&<0.25	
Portfolio 1A	t=.147085	t=-2.271726	t=551938	
	x>0.25	<<0.025 *	k>0.25	
Portfolio 3A	t=.524610	t=802213	t=.637852	
	&>0.25	0.1 <x<0.25< td=""><td>k&gt;0.25</td></x<0.25<>	k>0.25	
Portfolio 2B	t=282721	t=9371	t=.413567	
	α>0.25	0.1 <k<0.25< td=""><td>&amp;&gt;0.25</td></k<0.25<>	&>0.25	
Portfolio 3B	t=639654	t=104404	t=598542	
	&>0.25	x>0.25		
Although Portfolios 2 and 2B are not significant at k=0.025 for the time periods used above, it is clear that the market responses to these two portfolios hold for a very short period of time, see Plots 2 and 5.				
Portfolio 2		PERIOD=44-49   t=-2.594057   &<0.025 *		
Portfolio 2B		t=-4.103052   K<0.005 *		

<sup>\*</sup>significant at k=0.025

## TABLE 1A

### FINANCIAL STATEMENTS AT A POINT IN TIME AS INFORMATION.

PORTFOLIOS	MARKET RESPONSE
1. Firms with both ST Opinion and P(B) n=13	see Plot 1 Market responded, day 31.
2. Firms with ST Opinion and P(NB) n=5	see Plot 2 Market responded. day 44. corrected with a positive trend at day 50.
3. Firms with No ST Opinion and P(B) n=32	see Plot 3 No market response.
4. Firms with No ST Opinion and P(NB) n=84	see Plot 6   Control portfolio.

Total n=134

## TABLE 1B

# MARKET RESPONSE TO "SUBJECT TO" REPORTS AND MODEL PREDICTIONS (THE EVIDENCE).

PORT	FOLIOS	HINDSIGHT EXPECTATION BASED ON MARKET SOMEHOW CORRECTLY ANTICIPATING ACTUAL OUTCOMES	COMMENTS
1 (a)	Bankrupt firms with ST and P(B) n=12	Expect negative residuals	Observed significant negative residuals.  Market reacts to both the information.
1 (b)	Non bankrupt firms with ST and P(B) n=1	Expect zero residuals	Sample too small
2 (a)	Bankrupt firms with ST but P(NB) n=1	Expect negative residuals	Sample too small
2 (b)	Non Bankrupt firms with ST but P(NB) n=4	Expect zero residuals	Observed significant negative residuals. Market was apparently fooled by ST opinion.
3 (a)	Bankrupt firms with no ST but P(B) n=27		Observed no response.  Market was apparently misled by the absence of a ST cpinion. This adds credence to the info. content of ST reports
3 (b)	Non bankrupt firms with no ST and P(B) n=5	Expect zero residuals	Observed no response.
4 (a)	Bankrupt firms with no ST and P(NB) n=18	Expect negative residuals	Observed no response. Market was misled by the absence of ST report and the P(NB).
4 (b)	Non bankrupt firms with no ST and P(NB) n=66	Expect zero residuals	Observed no response as expected.

# TABLE 1C

#### CHANGES IN OPINIONS AND/OR PREDICTIONS AS INFORMATION.

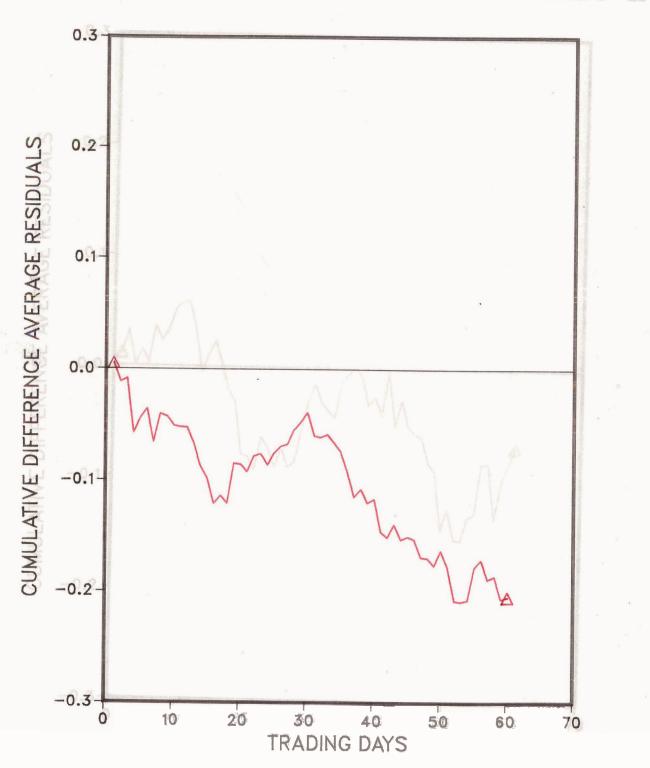
GROUPS **	MARKET RESPONSE
1. Both changes to ST Opinion and P(B) n=1	Sample too small
2. Change to ST from No ST   Opinion with no change   in predictions. n=4	Market responded from t=10. The average lag in the release of the financial statements as compare to the year before was 14 days.
3. Change to No ST from ST Opinion with no change in predictions.	No market response. (ignored, as sample size is too small).
P(NB) with no change in auditor's reports.	No market response.
5. Change to P(NB) from P(B) with no change in auditor's reports.	Sample too small
6. Both change to No ST Opinion and P(NB). n=0	Sample too small
7. No change in Predictions and auditor's reports. n=75	Plot 8 Control Group. No market response.
Total n=93	

\*for market response to groups 2 to 4, see Plot 7.

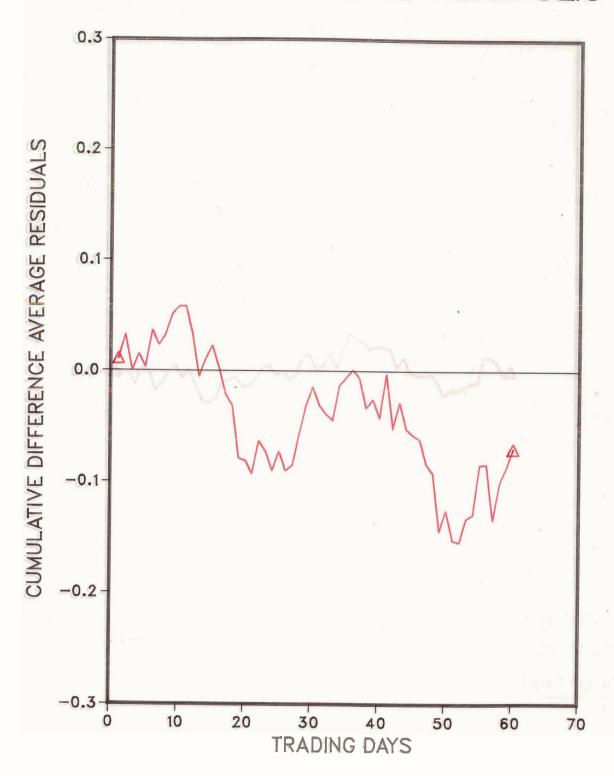
\*\*Note that Groups are used instead of Portfolios for Plots
7 and 8 to indicate that the change in opinions and/or
predictions are now used to define information.

\*\*\*The market response to the above Groups are based on
visual inspection of Plots 7 and 8. No statistical test
was deemed necessary.

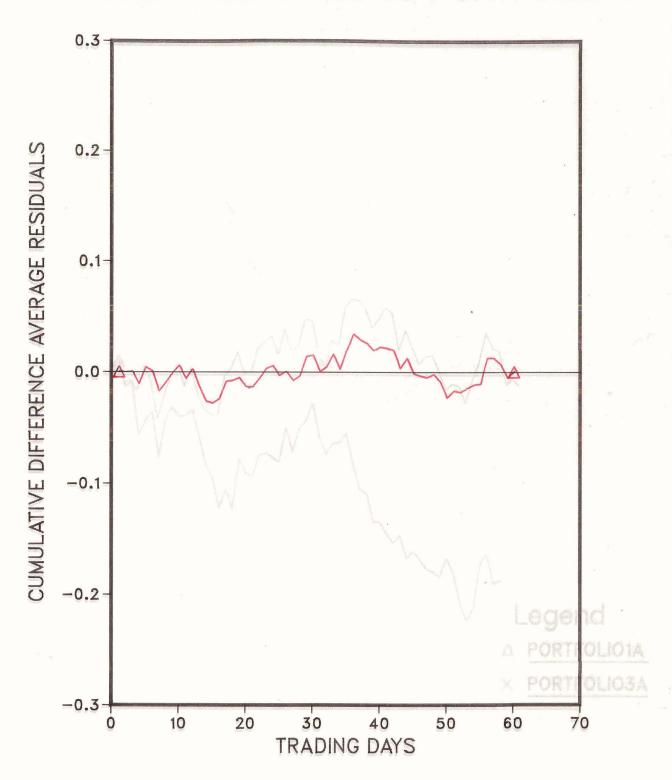
PLOT 12 MARKET RESPONSE TO PORTFOLIO 12



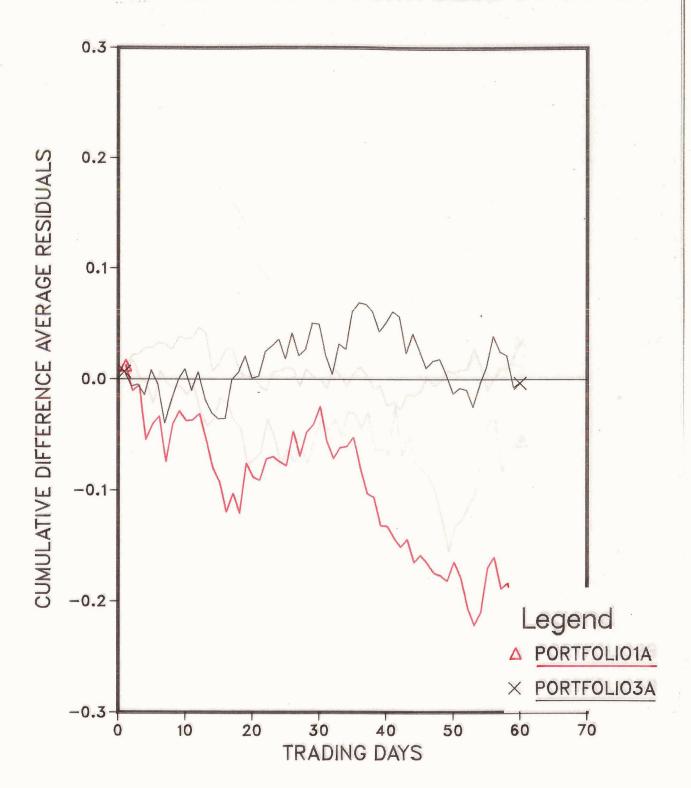
PLOT 2
MARKET RESPONSE TO PORTFOLIO 2



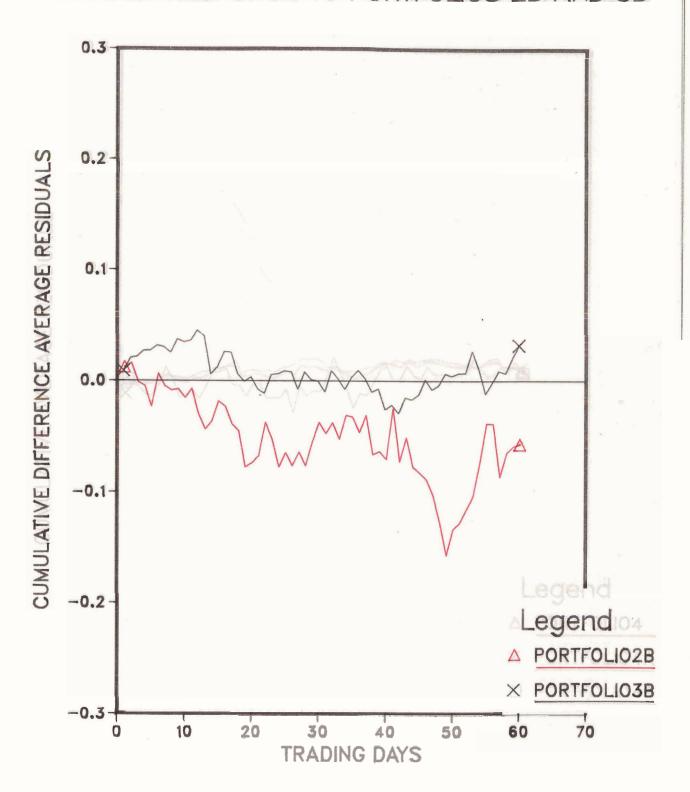
PLOT 3
MARKET RESPONSE TO PORTFOLIO 3



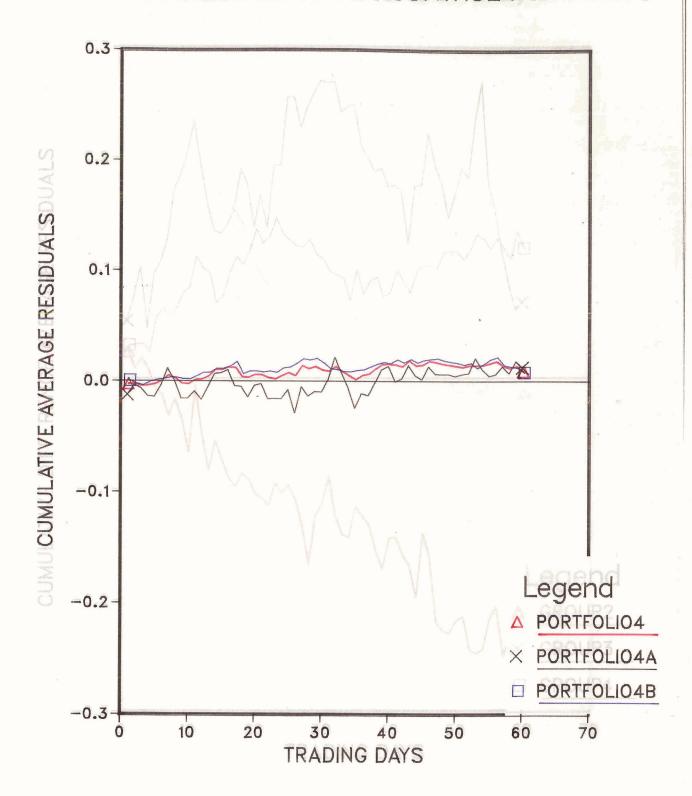
PLOT 4
MARKET RESPONSE TO PORTFOLIOS 1A AND 3A



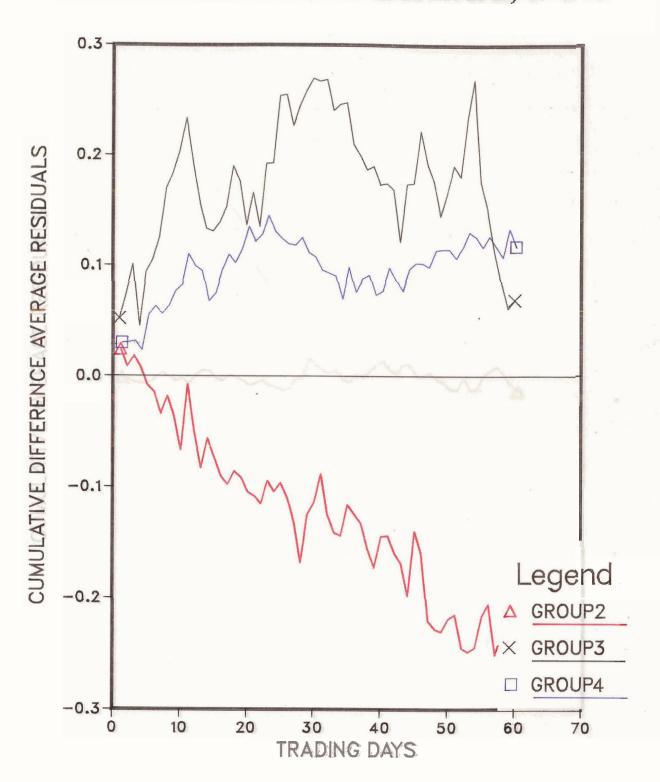
PLOT 5
MARKET RESPONSE TO PORTFOLIOS 2B AND 3B



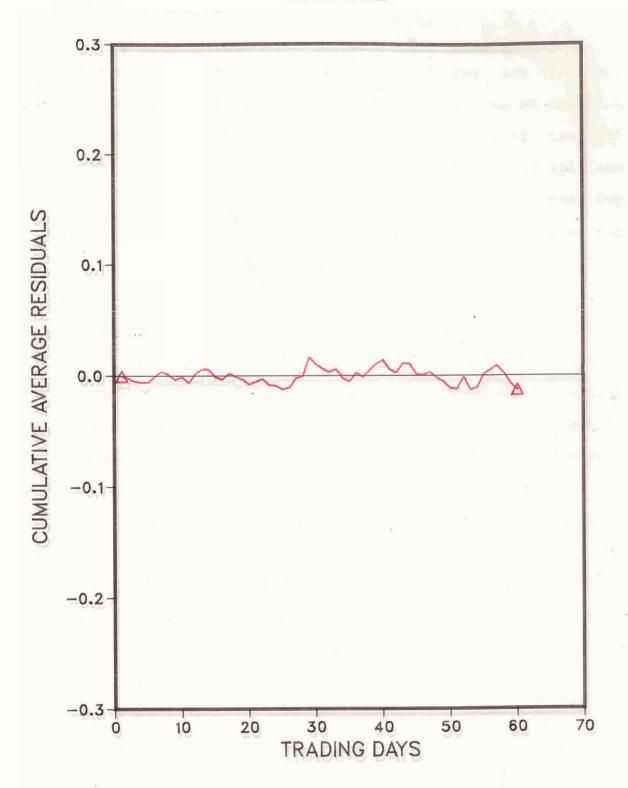
PLOT 6
MARKET RESPONSE TO THE CONTROL PORTFOLIOS



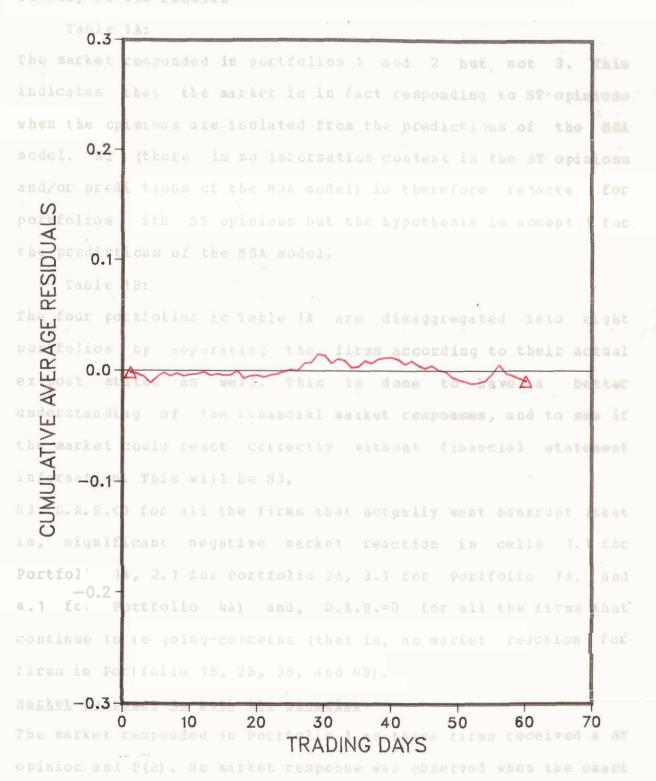
PLOT 7 MARKET RESPONSE TO GROUPS 2, 3 AND 4



PLOT 8
MARKET RESPONSE TO CONTROL GROUP 7



PLOT 9
CUM. RESIDUALS OF ALL THE FIRMS IN THE SAMPLE



Summary of the results

Table 1A:

The market responded in portfolios 1 and 2 but not 3. This indicates that the market is in fact responding to ST opinions when the cpinions are isolated from the predictions of the MDA model. H2 (there is no information content in the ST opinions and/or predictions of the MDA model) is therefore rejected for portfolios with ST opinions but the hypothesis is accepted for the predictions of the MDA model.

Table 1B:

The four portfolios in Table 1A are disaggregated into eight portfolios by separating the firms according to their actual ex-post status as well. This is done to have a better understanding of the financial market responses, and to see if the market could react correctly without financial statement information. This will be H3,

H3: D.A.R.<0 for all the firms that actually went bankrupt (that is, significant negative market reaction in cells 1.1 for Portfolio 1A, 2.1 for Portfolio 2A, 3.1 for Portfolio 3A, and 4.1 for Portfolio 4A) and, D.A.R.=0 for all the firms that continue to be going-concerns (that is, no market reaction for firms in Portfolio 1B, 2B, 3B, and 4B).

#### Market response to both the signals:

The market responded in Portfolio 1 as these firms received a ST opinion and P(B). No market response was observed when the exact

opposite information was signaled. The results of Table 1B seems to indicate that the stock market does rely on the aggregate financial statements for information with respect to the evaluation of insolvency.

#### Appropriateness of market response:

The market did not respond to portfolios where the firms subsequently went bankrupt, and responded incorrectly Portfolio 2 (b) when in fact these firms continue as going-concerns (although they did receive going-concern qualifications). Thus, H3 is rejected. The market could not distinguish correctly those firms that will subsequently fail from those that continue as going-concerns. Similar results were reported by Westerfield (1970a) and Altman (1971). Hennawy and Morris (1983) reported the opposite. They found that the market anticipated the firm's failure up to five years in advance.

# Market response to ST opinions and to MDA model predictions individually:

The results from Portfolio 2(b) and 3(a) indicate that the market responded to ST opinions even if the opinions turned out to be wrong. This could be explained by an excessive reaction to current information, which Arrow (1982) suggested, characterizes all the securities and future markets. Also, the model predictions by themselves did not trigger any market reaction even when the predictions were correct. This is also consistent with the findings of Altman and Brenner (1981).

Interpretations of the results

Financial statements are prepared on the assumption that a firm will continue as a going-concern. The auditor does not search for evidential matter relating to the entity's continued existence. Only when information contrary to that assumption is brought to his attention while applying auditing procedures, primarily for other purposes, does the auditor initiate a search for such evidence [Statement on Auditing Standards Number 34]. As such, a clean opinion need not be, nor (I believe) will be, interpreted as a signal that a firm will not go bankrupt. Whenever there is a possibility of receiving a return over and above that of investing in a risk free asset, the probability of insolvency of a firm is always positive.

Participants in the stock market may not use an MDA model any explicit model to predict possible insolvency. However, the accuracy of the MDA model used in this thesis indicates that it captures the main elements that ultimately lead to a firm's failure. Given an efficient market (as assumed), the market will have used and responded to these elements. There is, however, a small but important difference. If investors made their decisions not usinq an explicit model, but rather relied on their subjective judgements (using the financial ratios as a basis for their decisions), then we would expect fewer firms to be predicted bankrupt by investors. Like auditors, investors firms will continue as going-concerns. Most assume that investors do not go all out to look for evidence that will contradict that assumption, as this thesis has done by using MDA model. This could explain the lack of market response to the MDA model predictions, as reported in this thesis ,by Altman and Brenner (1981), and Westerfield (1970a). \*\* If the above argument is accepted, then the direction of the bias in mУ results clear. Portfolios 1 and 2 make up the entire population of firms that receive ST opinions in my sample. Firms in Portfolio 1 also P(B). Using my argument above, some of these firms will not be P(B) by the investors. As such, some firms from Portfolio 1 should be in Portfolio 2. As the market response is greater for firms in Portfolio 1 on average, this would cause response to Portfolio 2 to be even more significant. There is, therefore, stronger evidence that investors do see ST opinions as relevant information.

Finally, ST opinions are relatively rare and are probably be given a lot of weight. A clean opinion or a P(NB), on the other hand, is simply the norm and such information is treated as no information and ignored. Thus, the "no market response" in Portfolios 3 and 4 is not due to (a) the market using the no ST opinions, (b) the market fooled by the no ST opinions, and (c) the market fooled by the no ST opinions and the P(NB). Rather, it should be seen as no information relating to the above events and thus, no market response was observed.

<sup>\*\*</sup>In my study and similar ones, the portfolios of firms P(B) by the MDA model are contaminated by firms not predicted bankrupt by investors, if investors do not use an explicit MDA prediction model.

The difference between the results in Table 1A and Table 1B as compared to Table 1C is that Table 1C is based on the change in audit opinions and/or predictions of the MDA model as information. Table 1A and Table 1B, on the other hand, are based on the opinions and/or predictions at a point in time as information, regardless of prior audit opinions and predictions. The results from the three tables above indicate that either of the above interpretations of events as information could be correct, as the results turn cut to be similar. Since Table 1C has a smaller sample size in each of it's portfolios than those of Table 1A and Table 1B, the results of Table 1C are used only to corroborate the evidence already discussed.

#### Self-fulfilling Prophecies

The hypotheses made in this section are:

H4: That the P(B), based on financial ratios, have no effect on the firm's ability to borrow.

H5: That the issue of a SI opinion has no effect on the firm's ability to borrow.

The statistical tool used is the exact method for 2X2 tables [Ostle, 1963]. It has the following form:

TABLE 12

THE EXACT TEST FOR 2X2 TABLES.

	A1	A2	TOTAL	!
B1 B2	a c	b đ	a+b   c+d	
TOT AL	a+c	b+d	   n   ========	   

The two fractions,  $\hat{p}_{1=a/(a+b)}$  and  $\hat{p}_{2=c/(c+d)}$  are the estimates of p1 and p2, the parameters of two binomial populations. The exact probability of observing  $\hat{p}_{1}$  and  $\hat{p}_{2}$  when  $p_{1=p2}$  (the proportion in row 1 equals the proportion in row 2 or the observed outcome is independent of A1 and A2) is

P1 = (a+b)!(c+d)!(a+c)!(b+d)!/a!b!c!d!n!

The final probability includes the probabilities of the most divergent fractions other than those observed. Assuming p1<p2, the next more divergent situation would be the one in which a and d are decreased by one, and b and c increased by unity or P2=(a+b)!(c+d)!(a+c)!(b+d)!/(a-1)!(b+1)!(c+1)!(d-1)!n! The same rule applies until  $P_{A+1}$  is calculated. The final probability is, therefore,  $P= \stackrel{A+1}{\leq} P_i$ .

Table 13 shows the 2X2 Table for those firms that actually went bankrupt. The columns show the number of firms that either had an increase or a decrease in their total debt (TD) while the rows show the number of firms that were either P(B) or P(NB). H4 can then be rewritten as H4: p1=p2. In other words, the proportion of firms that have less TD is the same whether the firms were P(B) or P(NB) (that is, the change in TD is independent of the model prediction). The use of only bankrupt

firms is an attempt to use firms with similar characteristics. These firms would generally need more financing, and using less debt the year following the predictions is assumed not to be of their own choice.  $\hat{p}1=0$  (proportion of firms that were P(NB) and used less debt) and  $\hat{p}2=0.3333$  (proportion of firms that were P(B) and used less debt). The probability of observing  $\hat{p}1$  and  $\hat{p}2$  if in fact p1=p2 is 0.1048 or 10.48%. With a fairly large probability H4 is accepted. The change in TD is independent of the MDA model predictions.

Table 14 is similar to Table 13 except that the the number of firms that either received a ST opinion or No ST opinion. H5 is now rewritten as H5: p1=p2. The change in independent of the auditor's opinion.  $\hat{p}_{1}=0.1304$  and  $\hat{p}_{2}=0.8$ . is The probability of observing p1 and p2 if p1=p2 is 0.007693 0.77%. Using  $\alpha$ =0.025, H5 is rejected. \*5 There is less than a would observe chance that these results if in fact the one change in TD is independent of the auditor's opinion with respect to going-concern qualifications. This thesis supports the Cohen Commission in that the issue of a ST opinion could be a self-fulfilling prophecy. A point to note is that all the five firms that receive a ST opinion in Table 14 are also P(B).

The above results are consistent with the market reaction to ST opinions. Bankers, who are also stock market participants, see a ST opinion as relevant information.

<sup>45</sup> Although the sample size is small, a  $\mathcal{X}^{\nu}$  test was also performed. The results was almost identical to those reported above.

# TABLE 13

SELF-FULFILLING PROPHECY WITH RESPECT TO MDA MODEL PREDICTION.

#### FIRMS THAT ACTUALLY WENT BANKRUPT.

PREDICTION	NO.OF FIRMS	NO. OF FIRMS	!
USING DATA	THAT USED LESS	THAT USED MORE	
FROM THE 2nd.	TOTAL DEBT THE	TOTAL DEBT THE	
	FOLLOWING		
STATEMENTS.	YEAR	YEAR	TOTAL
P(NB)	0 (1.68)	7 (5.32)	7
P (E)	1   6 (4.32)	   12 (13.67)	   18
• •	i		
TOT AL	6	19	25

#### TABLE 14

SELF-FULFILLING PROPHECY WITH RESPECT TO "SUBJECT TO" OPINION.

#### FIRMS THAT ACTUALLY WENT BANKRUPT.

OPINIONS IN THE 2nd. LAST	NO. OF FIRMS THAT USED LESS TOTAL DEBT THE	THAT USED MORE	
	•	FOLLOWING   YEAR	TOTAL
NO ST OPINION	3 (5.75)	20 (17.25)	23
ST OPINION	4 (1.25)	1 (3.75)	5
TOT AL	     7 	21	28

The values in the parenthesis are the expected values if the columns and the rows are independent of each other, that is, the change in the amount of debt used is not affected by the MDA model prediction in Table 13 and not affected by the ST opinion in Table 14. Using the notation in Table 12, a\*=((a+c)/n)(a+b). The values for the other three cells are likewise determined.

#### V. Conclusion

This thesis was an attempt to overcome the problems of past studies in evaluating the information content of ST opinions. It used the prediction of the MDA model to control for the information in the financial statements. This serves to isolate the information content of the audit opinions. This approach is by no means restricted to the evaluation of the information content of ST opinions. The same approach could be used in most MBAR studies. If events A and B occur simultaneously, then one need to find a tool to predict event A, for example. The prediction of event A can then be used as a control for the information in event A. The information content of each of the events is then determined in isolation from the effects of the other information.

The results in this study indicates that there is information content in ST opinions. It also found that an MDA model could perform better than ST opinions in predicting insolvency. Finally, evidence indicates that the issue of a ST opinion could be a self-fulfilling prophecy. That is, firms that receive a ST qualification may be denied loans because of the qualification and this causes the firm to fail.

Given the above results, which of the four propositions suggested in Chapter 1 should be accepted? Proposition 1 states that if the ST opinions generally predict correctly and are seen as a relevant information, then, ST opinions should continue to

provided. Proposition 2 differs from proposition 1 only if the financial markets do not see the ST cpinions as relevant information. In this case, the accounting profession should educate the public on their usefulness. Proposition 3 that if the ST opinions do not predict as well as the MDA model. but are seen as relevant information in financial markets, then the auditor should make use of the prediction model to help them decide if a qualification should be issued. Proposition 4, the other hand, proposed the elimination of the ST opinions if they could not predict as well as the MDA model, and are not seen as relevant information in financial markets. Given that the results in this thesis indicate that the ST opinions do not predict well as the MDA model but are seen as useful information in the financial markets, Proposition 3 is the most appropriate conclusion. It suggest that auditors make use of the prediction model to help them decide if a qualification should This was also suggested by Altman (1974, 1982). issued. However, the evidence is not straight-forward. As above, there is strong evidence that the issue of ST opinions could be a self-fulfilling prophecy. Should Wе accept proposition 3 even if the issue of a ST opinion, in itself, may cause a firm to fail? Turning the question around, one could ask, would banks behave differently if these firms did not receive a ST opinion? It is now clear that the results in Table 13 (Chapter 4) are the crucial issue. These firms actually failed and they are either P(B) or P(NB). The probability of

observing the results in Table 13 if the change in the T.D. used is independent of the MDA model predictions is 10.48%. If one accept this as too large a probability to reject the hypothesis of independence above, then the conclusion is obvious. Even without ST opinions, firms P(B) are likely to be denied credit. Bank loan officers do not have to use the ST opinions and thus, the issue of ST opinions could not, in itself, cause bankers to refuse credit (note again, that all five firms that received a ST opinion are also P(B) in Table 14).

The conclusion is less obvious if we accept the hypothesis that the change in TD is independent of the MDA model prediction. Do we provide information that is useful but may cause the firm to fail, which may not happen if that information is not provided?

A final note is the findings of Kida (1980). questionnaire approach, he found that auditors were able to discriminate problem from nonproblem firms, given only ratio data, with an average accuracy of 83%. The accuracy using an MDA model was 90%. This, therefore, suggests that the results in this thesis and reported by Altman (1974, 1982) that ST opinions do not predict as well as an MDA model may not be due to inability to predict on the part of the auditors but rather, it additional considerations. The of is the consequence opinion, for example, losing a qualifying an consequences of client or resulting in a lawsuit, may affect decisions to issue going-concern qualifications. Chow and Rice (1982) provided some

evidence that firms switch auditors more frequently after receiving qualified opinions. Although proposition 3 is supported in this thesis, it is realised that it may be impractical as long as auditing firms see the costs of qualifying an opinion as exceeding the benefits of doing so. The costs and benefits could be changed through legislation or a more strict requirement to qualify an opinion with respect to going-concern. Lastly, it is clear that this thesis rejects the conclusion of the Cohen Commission and supports the view that ST opinions are useful and should continue to be provided.

#### Limitations and Extensions

The main limitation of this thesis is the sample size. A larger sample size, preferably 2 to 3 times the study using a sample size used in this thesis, would be the most appropriate extension of this thesis. One could use firms that failed prior to 1972 in addition to the firms used in this thesis. This, however, runs the risk that the MDA model prediction may not be appropriate for the firms in the 1972 to 1982 period. characteristics of failed firms may change over time. The other possibility is to use firms traded over-the-counter or regional exchanges. This requires either daily or security returns to be currently available, or the arduous and costly task of compiling them. It also requires that financial statements be available. Other possible extensions of thesis include incorporating explicitly a dynamic bankruptcy prediction model, and using its predictions as the control for the information content of the financial statements. A study of the cost and benefit to the auditors of qualifying an opinion would be helpful, and may be used to predict the possibility of auditors issuing a ST opinion. Such information will be useful as the stock market does respond to these qualifications. Finally, a study using an approach similar to that of Estes (1982) should be utilized to study the differential in the information content of different ways of presenting the current ST opinions.

#### REFERENCES

- Alderman, W.C., "The role of uncertainty qualifications: evidence to support the tentative conclusion of the Cohen Commission", <u>Journal of Accountancy</u> (Nov. 1977), pp. 97-100.
- Altman, E.I., "Financial ratios, discriminant analysis and the prediction of corporate bankruptcy", <u>Journal of Finance</u> (Sept. 1968).
- ."A reply", <u>Journal of Finance</u> (Dec. 1970)
- . Corporate Bankruptcy in America (Lexington, 1971)
- \_\_\_\_\_. "Accounting implications of failure prediction models", <u>Journal of Accounting, Auditing and Finance</u> (Fall 1982).
- Altman, E.I. and McGough, T.P., "Evaluation of a company as a going-concern", <u>Journal of Accountancy</u> (Dec. 1974), pp. 50-57.
- Altman, E.I., Haldeman, R. and Narayanan, P., "ZETA Analysis", <u>Journal of Banking and Finance</u> (1977), pp.29-54.
- Altman, E.I. and Brenner, M., "Information effects and stock market response to signs of firm deterioration", <u>Journal of Financial and Quantitative Analysis</u> (1981).
- American Institute of Certified Public Accountants, Commission on Auditors' Responsibilities, "Report, Conclusion and Recommendations", (AICPA, 1978).
- \_\_\_\_\_. Statement on Auditing Standards Number 34, "The auditor's considerations when a question arises about an entity's continued existence", (AICPA, 1981).
- Anderson, T.W., An <u>Introduction</u> to <u>Multivariate Statistical</u>
  <u>Analysis</u> (John Wiley, 1958).
- Arrow, K., "Risk perception in psychology and Economics", <u>Economic Inquiry</u> (Jan. 1982).
- Bailey, W.T., "An appraisal of research designs used to investigate the information content of audit reports", The <u>Accounting Review</u> (Jan. 1982).
- Ball, R., Walker, R.G. and Whittred, G.P., "Audit gualifications and share prices", <u>Abacus</u> (June 1979).

- Beaver, W.H., "Financial ratios as predictors of failure", Empirical Research in Accounting (Selected studies, 1966).
- Prentice Hall, 1981).
- Beaver, W.H., Clarke, R. and Wright, W.F., "The association between unsystematic security returns and the magnitute of earnings forecast errors", <u>Journal of Accounting Research</u> (Autume 1979)
- Blum, M., "Failing company discriminant analysis", <u>Journal of Accounting Research</u> (Spring 1974).
- Canadian Institute of Chartered Accountants, Handbook, Section 5510.54.
- Chambers, R.J., "The functions of published financial statements", <u>Accounting and Business Research</u> (Spring 1976), pp. 83-94.
- Chow, C.W. and Rice, S.J., "Qualified audit opinions and auditor switching", The Accounting Review (April 1982).
- Collins, R.A., "An empirical comparison of Bankruptcy prediction models", <u>Financial Management</u> (Summer 1980), pp.52-57.
- Dambolena, I.G. and Khoury, S.J., "Ratio stability and corporate failure", <u>Journal of Finance</u> (Sept. 1980).
- Deakin, E.B., "A discriminant analysis of predictors of business failure", <u>Journal of Accounting Research</u> (Spring 1972).
- Edmister, R.O., "An empirical test of financial ratio analysis for small business failure prediction", <u>Journal of Financial and Quantitative Analysis</u> (March 1972), pp. 1477-1493.
- Eisenbeis, R.A., "Pitfalls in the application of discriminant analysis in business, finance and economics", <u>Journal of Finance</u> (June 1977).
- Eisenbeis, R.A. and Avery, R.B., <u>Discriminant Analysis and Classification Procedures</u> (Lexington, 1972).
- Elias, N. "The effects of human asset statements on the investment decision: An experiment", <u>Empirical Research in Accounting</u> (Selected studies, 1972).
- Elliott, J.A., "'Subject to' audit opinions and abnormal

- security returns-outcomes and ambiguities", <u>Journal of Accounting Research</u> (Autumn 1982), pp.617-638.
- Estes, R., The <u>Auditor's Report</u> and <u>Investor Behaviour</u> (Lexington, 1982).
- Estes, R. and Reimer, M., "A study on the effect of qualified auditors' opinions on bankers' lending decision", <u>Accounting and Business Research</u> (Autumn 1977), pp. 250-259.
- Farrar, D.E. and Glauber, R.R., "Multicollinearity in regression analysis: The problem revisited", <u>The Review of Economics and Statistics</u> (Feb. 1967), pp.92-107.
- Fess, P.E. and Ziegler, R.E., "Readership of the audit report", The CPA Journal (June 1977), pp.5-6.
- Financial Accounting Standards Board, Statement of Financial Accounting Concepts Number 1, "Objectives of Financial Reporting by Business Enterprise", (Nov. 1978).
- Firth, M., "Qualified audit reports: Their impact on investment decisions", The Accounting Review (July 1978), pp.642-650.
- Foster, G., Financial Statement Analysis (Prentice-Hall, 1978).
- Gilbert, E.S., "On discrimination using qualitative variables",

  Journal of American Statistical Association (Dec. 1968).
- Hendricks, J.A., "The impact of human resource accounting information on stock investment decisions: An empirical study", The Accounting Review (April 1976), pp. 292-305.
- Hennawy, F.R.H.A. and Morris, R.C., "Market anticipation of corporate failure in the U.K.", <u>Journal of Business</u>
  <u>Finance and Accounting</u> (Autumn 1983), pp.359-372.
- Johnson, C.G., "Ratio analysis and the prediction of firm failure", <u>Journal of Finance</u> (Dec. 1970).
- Joy, M.C. and Tollefson, J.C., "On the application of discriminant analysis", <u>Journal of Financial and Quantitative Analysis</u> (Dec. 1975).
- Kida, T., "An investigation into auditors continuity and related qualification judgements", <u>Journal of Accounting</u>
  Research (Autumn 1980), pp. 506-523.
- Lachenbruch, P.A., <u>Discriminant Analysis</u> (Hafner, 1975).
- \_\_\_\_\_. "An almost unbiased method of obtaining confidence intervals for the probability of misclassification in

- discriminant analysis", Biometrics (Dec. 1967).
- Lev, B., "Financial failure and information decomposition measure", in <u>Accounting in Perspective: Contributions to Accounting Thoughts by Other Disciplines</u>, Sterling, R.R. and Bentz, W.F. edition (Southwestern, 1971), pp. 102-111.
- Prentice-Hall, 1974), pp. 145-151.
- Lev, B. and Ohlson, J., "Market-based empirical research in accounting: A review, interpretation and extension", <u>Journal of Accounting Research</u> (Vol. 20, Supplement 1982).
- Libby, R., "Accounting ratios and the prediction of failure: some behavioural evidence", <u>Journal of Accounting Research</u> (Spring 1975), pp. 150-161.
- \_\_\_\_\_. "The impact of uncertainty reporting on loan decision", <u>Journal of Accounting Research</u> (Vol. 19, Supplement 1979), pp. 35-57.
- May, R.G. and Sundem, G.L., "Research for accounting policy: An overview", The Accounting Review (Oct. 1976).
- McDonald, D.L., "Accounting ratios and stock prices in a regional exchange", <u>Simon Fraser University Department of Economics and Commerce Discussion paper</u> (1977).
- Meyer, P.A. and Pifer, H.W., "Prediction of bank failures", <u>Journal of Finance</u> (Sept. 1970), pp.853-868.
- Moyer, C.R., "Forecasting financial failure: A re-examination", Financial Management (Spring 1977), pp. 11-15.
- Ohlson, J.A., "Financial ratios and the probabilistic prediction of bankruptcies", <u>Journal of Accounting Research</u> (Spring 1980), pp. 109-131.
- Ostle, B., "Statistics in Research", (Iowa State Univ. Press, 1963, 2nd.edition).
- Richardson, F.M. and Davidson, L.F., "An exploration into bankruptcy discriminant model sensitivity", <u>Journal of Business Finance and Accounting</u> (Summer 1983), pp. 195-207.
- Santomero, A.M. and Vinso, J.D., "Estimating the probability of failure for commercial banks and the banking system", Journal of Banking and Finance (1977), pp. 185-205.
- Scott, J.H., "A theory of optimal capital structure", <u>Bell</u>
  <u>Journal of Economics</u> (Spring 1976), pp. 33-54.

- empirical predictions and theoretical models", <u>Journal of Banking</u> and Finance (Sept. 1981), pp.317-344.
- Shank, J.K., Dillard, J.F. and Murdock, R.J., "Lending officers' attitudes toward 'subject to' audit opinions", <u>The Journal of Commercial Bank Lending</u> (March 1978), pp. 31-45.
- opinions", <u>Financial Executive</u> (Nov. 1979), pp. 28-35.
- Shank, J.K., Dillard, J.F. and Bylinski, J.H., "What do 'subject to' auditors' opinions mean to investors?", <u>Financial Analysts Journal</u> (Jan-Feb 1979), pp.41-45.
- Sinkey, J.F., "A multivariate statistical analysis of the characteristics of problem banks", <u>Journal of Finance</u> (March 1975).
- Stiglitz, J.E., "Some aspects of the pure theory of corporate finance: bankruptcies and take-overs", <u>Bell Journal of Economics and Management Science</u> (Autumn 1972), pp. 458-482.
- Tinsley, P.A., "Capital Structure, precautionary balances and the valuation of the firms: The problem of Financial Risk", <u>Journal of Financial and Quantitative Analysis</u> (March 1970), pp.33-62.
- Vinso, J.D., "A determination of the risk of ruin", <u>Journal of Financial and Quantitative Analysis</u> (March 1979), pp. 77-100.
- Westerfield, R., "Pre-bankruptcy stock price performance", Wharton School of Finance working paper (Fall 1970)a, reported in Corporate Bankruptcy in America Altman, E.I., (Lexington, 1971).
- Whittred, G.P., "Audit qualifications and the timeliness of corporate annual reports", <u>The Accounting Review</u> (Oct. 1980).
- Whittred, G.P. and Zimmer, I., "Timeliness of financial reporting and financial distress", <u>The Accounting Review</u> (April 1984), pp. 287-295.
- Wilcox, J.W., "A simple theory of financial ratios as predictors of failure", <u>Journal of Accounting Research</u> (Autumn 1971), pp. 389-395.
- data", Empirical Research in Accounting (Selected Studies, 1973), pp. 163-190.

#### APPENDIX A

SAMPLE B (BANKRUPT FIRMS -MANUFACTURING INDUSTRY ONLY)

=====			
	NG.	CO.NO.	GLOVER INC TOBIN PACKING CO INC FABIEN CORP FIRST HARTFORD CORP SCOTTEX CORP SEQUOYAH INDUSTRIES INC BOTANY INDS INC CS GROUP INC GARLAND CORP-CL A
Firm	1B	379848	GLOVER INC
Firm	2B	888837	TOBIN PACKING CO INC
Firm	3B	302819	FABIEN CORP
Firm	4B	320488	FIRST HARTFORD CORP
Firm	5B	810 122	SCOTTEX CORP
Firm	6B	817460	SEQUOYAH INDUSTRIES INC
Firm	7B	101241	BOTANY INDS INC
Firm	8B	126351	CS GROUP INC
Firm	9B	101241 126351 366064	
Firm	10B 11B 12B 13B 14B 15B	551675	LYNNWEAR CORP-CL A
Firm	11 B	640303	NELLY DON INC
Firm	12B	950698	WENTWORTH MFG CO
Firm	13B	950698 731588	POLORON PRODUCTS INC
Firm	14B	959078	WESTERN ORBIS CO
Firm	15B	112061	BRODY (B.) SEATING CO
ricm	16B	805567 703181	SAXON INDUSTRIES
Firm	1/B	703 181	PATERSON PARCHMENT PAPER CO
Firm	18B	591846	METROPOLITAN CONS INDS INC
Firm	19 B	868647	SUPRONICS CORP
Firm	20 B	779664	ROWLAND INC
Firm	21B	749222	RAI INC
Firm	228		DCA DEVELOPMENT CORP
Firm	238	577438	MAULE INDUSTRIES INC
Firm	24.0	880447	TENNESSEE FORGING STEEL CORP
Firm Firm	23B	925385	VESPER CORP
Firm		829 880 9 13 45 3	
Firm	28B		
Firm		781768 3893 <b>70</b>	
Firm		738102	
Firm		237570	
		286 155	
	32B	376424	GLADDING CORP
Firm		670096	NOVO CORP
Firm	35B	521687	LEADER INTL INDUSTRIES INC
Firm	36B	524166	LEECO INC
Firm	37B	858552	STELLAR INDUSTRIES INC-DEL
Firm	38B	018859	ALLIED ARTISTS INDUSTRIES
Firm	39B	007752	AERODEX INC
Firm	40 B	683714	OPEN ROAD INDS
Firm	41B	400118	GRUEN INDS INC
Firm	42B	042078	ARMAC ENTERPRISES INC
Firm	43B	58 <b>5 16</b> 3	MEGO INTERNATIONAL
Firm	44B	858518	STELBER INDUSTRIES INC
Firm	45B	872415	TGC INC
Firm	46B	559142	MAGIC MARKER CORP

SAMPLE N (NON-BANKRUPT FIRMS)

FIRM NO.		CO. NO.	COMPANY NAME
Firm			GREYHOUND CORP
Firm	2 N	484098	KANE-MILLER CORP
Firm	3 N	012347	ALBANY INTL CORP
	4 N 5 N	206813	CONE MILLS CORP
	6 N	235773 574803	DAN RIVER INC MASLAND (C.H.) & SONS
			CHAMPION PRODUCTS INC
	8 N	235721	DAMON CREATIONS-CL A
	9 N	409189	HAMPTON INDUSTRIES
	10 N		PALM BEACH INC
Firm	11 N		PURITAN FASHIONS CORP
	12N	918204	VF CORP
Firm	13N	636418	NATIONAL HOMES CORP
	14 N	886498	TID WELL INDUSTRIES
	15 N	313693	FEDERAL PAPER BOARD CO
	16N	699313	PARAMOUNT PACKAGING MOORE CORP LTD
	17 N	615785	MOORE CORP LTD
	18 N		SUN CHEMICAL CORP
	19N		BARRY (R.G.)
Firm	20 N		NATIONAL GYPSUM CO
Firm	21N	629449	
Firm	22 N		U S STEEL CORP
Firm Firm	23N 24N		ORMAND INDUSTRIES JENSEN INDUSTRIES
	25N		OVERHEAD DOOR CORP
Firm	26 N	150033	
	27 N	562706	
	28 N		BARRY WRIGHT CORP
	29 N		FEDERAL SIGNAL CORP
Firm	30 N		OAK INDUSTRIES INC
Firm	31N	A Committee of the Comm	FORD MOTOR CO
Firm	32N	235811	
Firm	33N	359370	FRUEHAUF CORP
Firm	34 N	754647	RAYMARK CORP
Firm	35 N	812132	SEALED POWER
Firm	36N	459362	INTL CONTROLS CORP
Firm	37N	189873	COACHMEN INDUSTRIES INC
Firm	38N	526264	LENOX INC
Firm	39 N	193378	COLECO INDS
Firm	40 N	292007	EMPIRE OF CAROLINA INC
	41N	601753	MILTON BRADLEY CO
	42N 43N	677 143 90545	OHIO ART CO BINNEY & SMITH INC
	43N		
			d to the firms for convenience and
THE LIMI	10	acre designe	the Cimme has a second to a contract day

the CO. NO. is assign to the firms by Compustat and CRSP.

#### APPENDIX B

#### FINANCIAL RATIOS USED IN THIS THESIS.

#### RATIO SYM. RATIOS

S(NI/TD) Standard Deviation of Net Income/Total Debt

C.R. Current Assets/Current Liabilities or Current Ratio

Q.R. Quick Assets/Current Liabilities or Quick Ratio

ST/TD Short Term Debt/Total Debt

TD/TA Total Debt/Total Assets or Debt-Equity Ratio

INT/S Interest Expense/Sales

MV/TD Market Value of Securities/Total Debt

CF/TD Cash Flow/Total Debt

NI/TD Net Income/Total Debt

CF/OC Cash Flow/Operating Cost for One Year

WC/OC Working Capital/Operating Cost for One Year

IBIT/TA Income Before Interest and Taxes/Total Assets

GP/S Gross Profit/Sales

RE/TA Retained Earnings/Total Assets

S/TA Sales/Total Assets

TA Total Assets in Millions of Dollars

The ratios are defined as in the Compustat Manual.

Precise specification for variables in the final MDA model:

Q.R. = Cash, short term investments and receivables over current liabilities.

TD/TA = Total long term debt, debt due in one year and notes payable in current liabilities (excluding deferred taxes, investment tax credit, accounts payable and income tax payable) over total assets.

NI/TD = Income after extraordinary items and discontinued operations over total debt.

APPENDIX C

			APPENDI			
	D. A.R.	C.D.A.R.	D.A.R.		D.A.R.	C.D.A.R.
	FOR	FOR	FOR	FOR	FOR	FOR
DAYS	PORT. 1	PORT.1	PORT.2	PORT.2	PORT.3	PORT.3
					=======	========
1	.005188	<b>.005188</b>	.010951	.010951	.000291	.000291
2	017025	011837	.021412		000414	
3	.003325	008512		000389	.000734	.000611
4	049296		.015438			010864
5	.013289	044519	012208	.002841	.015404	.004540
6	.008697	035822	.033499			
			- "			000790
7	030186	066008	013426			017627
8	.025874	040134	.009357			009192
9	002678	042812	.018654	.050925		000961
10	008423	051235	.006716	.057641	.006957	
11	00 120 5	052440	.000404	.058045	012156	006160
12	000064	052504	024707	.033338	.008961	.002801
13	014776	067280	039093	005755	016156	013355
14	020258	087538	.016282	.010527	012944	026299
15	010582	098120	.012184			028183
16	023367	121487		.002522		024216
17	.007549	113938		021891		008449
18	006997	120935		031912		007844
19	.036150	084785		079079	.002469	
20	000887	085672			- /	
21					008140	
	006758	092430			.000059	
22	.014343	078087		063424	.007785	
23	.001943	076144		072666	.008894	.003223
24	010245	086389	017547		.002306	
25	.010905	075484		072784	008621	
26	.006125	069359		090178	.003764	
<b>27</b>	.00 1945	067414		085357		007707
28	.012554		.027351		.004089	
29	.006870	047990		031257	.017535	.013917
30	.009137	038853	.016838	014419	.001240	.015157
31	021034	059887	016828	031247	014649	.000508
32	001252	061139	007660	038907	.003867	.004375
33	.002368	058771	005956	044863	.011760	.016135
34	007462	066232	.032038	012825	013513	.002622
35	007824	074056		006145	.017618	.020240
36	018372	092428	.007489	.001344	.014529	.034769
37	022590	115018		006555	005295	.029474
38	.007374	10 76 44		033624	003217	.026257
39	012601	120245		025422		.019243
40	.003777	116468		042678	.003630	.022873
41	029701	146169		002441	000991	.021882
42	005083	15 1252		052330		.019577
					002305	
43	.011757	- 139495		028247		.003115
44	013825	153320		052358	.009387	
45	.003140	150180		057962		001403
46	002668	152848		061704		
47	016316	16 9 1 64		084110		005104
48	000550	169714	008227	092337	. 003209	001895

```
49
    -.006917
              -.176631
                        -.052399 -.144736
                                           .007246 -.009141
 50
                         .019216 -.125520 -.014094 -.023235
      .013811
              -.162820
 51
                        -.027094 -.152614
              -.178117
    -.015297
                                           .006375 -.016860
 52
                         -.001738 -.154352 -.001474 -.018334
     -.029976
              -.208093
 5.3
     -.000835
              - . 208928
                          .021125 -.133227
                                           .003603 -.014731
 54
                          .003875 -.129352
     .00 1369
              -.207559
                                           .003120 -.011611
 55
                          .044749 -.084603
      .029532
              -.178027
                                           .000961 -.010650
 56
                          .000264 -.084338
                                          .023203
      .006825
              -. 17 1202
                                                    .012553
 57
                         -.050301 -.134639
                                           .000127
     -.017659
              -.188861
                                                    .012680
 58
                         .033974 -.100665 -.005869
                                                    .006811
      .002856
              -.186005
                          .013746 -.086919 -.011781 -.004970
 59
     -.020717
              -.206722
 60
      .00 200 2
              -. 20 4720
                          .016789 -.070130 -.005130 -.000160
= Difference Average Residuals.
C.D.A.R. = Cumulative Difference Average Residuals.
         = Portfolio 1.
PORT.1
Estimated day of release of auditors report is day 31.
```

#### APPENDIX D D.A.R. C.D.A.R. D.A.R. C.D.A.R. FOR FOR FOR FOR DAYS PORT. 1A PORT. 3A PORT. 1A PORT. 3A \_\_\_\_\_\_ ======= 1 . 0 126 48 .007042 .012648 .007042 2 -.023036 -.010388 -.013060 -.006018 3 .005338 -.005050 .001602 -.004416 4 -.049385 -.054435 -.009487 -.013903 5 .013875 .022313 -.040560 .008410 6 -.004913 .007320 -.033240-.0133237 -.041195 -.034541 -.074435 -.039454 8 .034306 -.040129 .020882 -.018572 9 .011639 -.028490 .018156 -.000416 10 -.008936 -.037426.009938 .009522 11 .000619 -.036807 -.019312-.009790 12 .005876 -.030931 .016770 .006980 13 -.023422-.054353 -.024968 -.017988 14 -.025775 -.080128 -.012289 -.030277 15 -.012635 -.092763 -.005286 -.035563 16 -.027020 -.119783 .000389 -.035174 17 .0 170 18 -.102765.034858 -.000316 .006788 18 -.018032-.120797.006472 18 .045144 -.075653 .014504 .020976 20 -.012548 -.088201 -.020022 .000.954 21 -.002792-.090993 .001830 .002784 22 .019398 -.071595 .022387 .025171 23 .001991 -.069604 .005103 .030274 24 -.004741 -.074345 .005953 .036227 25 -.003515-.077860 -.017614 .018613 26 .031149 -.046711 .023245 .041858 27 -.022592-.069303 -.020446 .021412 28 .021546 -.047757 .005768 .027180 29 .007043 -.040714 .023495 .050675 30 .0 16472 -.024242 -.000642 .050033 31 -.032018-.056260 -.028321 .021712 32 -.015167 -.071427 -.016905 .004807 33 .010128 -.061299 .032125 .027318 34 .000834 -.060465 -.004824 .027301 35 .033911 .008466 -.051999 .061212 36 -.028054-.080052 .008028 .069240 37 -.022743-.102795-.001426 .067814 38 -.003208 -.106003 -.006921 .060893 39 -.025725 -.131728 .043147 -.01774640 -.000330 -.132058.007612 .050759 41 -.010901 -.142959.010398 .061157 42 -.008358 -.151317 -.004576 .056581 .007166 .023397 43 -. 144151 -.03318444 -.021106 -.165257 .017419 .040816 .006998 45 **-.158259** -.015245 .025571 46 -.008005 -. 166264 -.015437 .010134 -.008310-. 174574 47 .006488 .016622 48 -.002237-.176811 .001672 .018294

```
49
                 -.181600
      -.004789
                             -.013854
                                         .004440
 50
       .017206
                 -. 164394
                            -.017287
                                        -.012847
 51
                              .005011
      -.0 14674
                 -.179068
                                        -.007836
 52
      -. 0 270 14
                 -.206082
                            -.001456
                                        -.009292
 53
      -.0 15520
                            -.015236
                 -.221602
                                        -.024528
 54
                              .019831
       .011778
                 -.209824
                                        -.004697
 55
                 -.169667
                              .016040
       .040157
                                         .011343
 56
                              .027895
       .009496
                                         .039238
                 -. 160171
 57
      -.028683
                 -.188854
                             -.014344
                                         .024894
 58
       .005420
                 -. 183434
                             -.003273
                                         .021621
 59
                 -.216301
                             -.028697
                                        -.007076
      -.032867
                              .004047
 60
       .005036
                 -.211265
                                        -.003029
Estimated day of release of auditors report is day 31.
```

### APPENDIX E

	D.A.R.	C.D.A.R.	D.A.R.	C.D.A.R.
	FOR	FOR	FOR	FOR
DAYS	*	PORT.2B	PORT.3B	PORT.3B
1	.0 12331	.012331	.009055	.009055
2	.003500	.015831	.011389	.020444
3 .	016901	001070	.001392	.021836
4	003757	004827	.005327	.027163
5	0 18546	023373	.000177	.027340
6	.029902	.006529	.004456	.031796
7	0 11450	004921	001325	.030471
8 9	003939	008860	005264	.025207
10	.001315 007972	007545 015517	.012180 002603	.037387
11	.008456	007061	.001517	.036301
12	022789	029850	.009251	.045552
13	014124	043974	005551	.040001
14	.007113	036861	034233	.005768
15	.018525	018336	.006849	.012617
16	004816	023152	.013756	.026373
17	0 160 66	039218	000998	.025375
18	006181	045399	019317	.006058
19	032441	077840	006895	000837
20	.003930	073910	.004131	.003294
21	.006023	067887	010683	007389
22	.030224	037663	004072	011461
23	0 15304	052967	.017063	.005602
24	0 250 22	077989	.000735	.006337
25	.0 131 15	064874	.002468	.008805
26	0 11792	076666	000668	.008137
27	.0 12360	064306	015900	007763
28	012400 .021767	076706 054939	.015852	.008089
29 30	.0 17423	034939	007199 001384	000494
31	010004	047520	001384	009985
32	.009769	037751	.019412	.009427
33	014826	052577	007937	.001490
34	.021721	030856	009071	007581
35	001596	032452	.011003	.003422
36	013900	046352	.006105	.009527
37	.015370	030982	007317	.002210
38	035368	066350	012204	009994
39	.002677	063673	.002870	007124
40	007004	070677	018912	026036
41	.045920	024757	.004207	021829
42	048154	072911	007511	029340
4.3	.021796	051115	.014105	015235
44	026472	077587	001602	016837
45	005389	082976	.004200	012637
46	005968 014464	088944 103408	.013937 009266	.001300
4 <b>7</b> 48	0 24558	127965	.003834	007966 004132
40	~. V Z4330	12/363	• 4 0 3 0 3 4	004 132

```
49
      -.029269
                              .010562
                 -.157234
                                         .006430
  50
       .023365
                            -.002077
                 -.133869
                                         .004353
  51
       .006005
                              .002402
                 -. 127864
                                         .006755
                              .000188
  52
       .0 12281
                 -.115583
                                         .006943
  53
       .0 116 11
                              .019821
                 -.103972
                                         .026764
  54
                             -.015727
       .030447
                 -.073525
                                         .011037
  55
       .034955
                 -.038570
                             -.022976
                                        -,011939
                              .009801
  56
      -.000085
                 -.038655
                                        -.002138
  57
                 -.086711
                              .010904
                                         .008766
      -.048056
  58
                             -.002003
                                         .006763
       .021735
                 -.064976
                              .013341
  59
       .005754
                 -.059222
                                         .020104
                 -.057248
                              .011955
  60
       .001974
                                         .032059
Estimated day of release of auditors report is day 31.
```

APPENDIX P

	D.A.R.	C.D.A.R.	D. A. R.	C.D.A.R.	D. A. R.	C.D.A.R.
	FOR	FOR	FOR	FOR	FOR	FOR
	GROUP2	GROUP2	GROUP3	GROUP3	GROUP4	GROUP 4
1		~~~~~	AC 16 4 1			
2	.024004 015589	.024004	.051641	.051641	.029758	.029758
3	.00 963 1	.008415	.023145	.074786	.000508	.030266
4		.018046	.025874	.100660	.001278	.031544
5	009983	.008063	055964	.044696	008273	.023271
6	016612 005997	008549	.049389	.094085	.032102	•055373
7	019902	014546	.011237	.105382	.007443	.062816
8	.016405	034448 018043	.044452	.169604	006794	.056022
9	019151	037194	.014293	.183897	.006979	.063001
10	029851	067045	.020693	.204590		.076472
11	.05 957 5	007470	.029026	.233616	·	.082228
12	04 3700	05 1 170	041354	.192262	.027957	.110 185
13	032126	083296	035699	.156563	010822	.099363
14	.027002	056294	023218	. 133345	004632 027348	.094731
15	017354	073648	0023218	.133343		.067383
16	016807	090455	.008382	.138990	.007276	.074659
17	007606	098061	.014160	.153149	.020788	100763
18	.012030	086031	.036921		.014316	.109763
19	005527	091558	014093	.175977		.102 141
20	013114	104672		= .136287	.020610	.114565
21	003650	108322	.029827	- " - —		.121596
22	006971	115293	031228	. 134886	013578 .006581	.121596
23	.020829	094464	.057385	. 192271		
24	009811	104275	.000286	. 192271	.016956	.145 133
25	.007790	096485	.000288		014458	.130675
26	013683	110168	.001237	.253794	006067 005043	.124608
2 <b>7</b>	02 155 1	13 17 19	028380		001217	.118348
28	036543	168262	.018497	.245028	.007028	.125376
29	.043447	124815	.013850		013666	.125376
30	.010813	114001	.010777		004052	.107658
31	.025631	088370	002655		011752	.095906
32	036704	125074	.001618		002644	.093262
33	016337	141411	028232		002703	.090559
34	00 2449	143860	.005770	_	020932	.069627
35	.027730	116130		.247387		.098494
36	008449	124579	037837		022827	.075667
37 .	008358	132937	009816		.012031	.087698
38	022851	155788	013085	.186649		.091233
39	017153	172941	.00 2883		018095	.073138
40	.028195	144746	016450			.076959
41	.000583	144163	.00 103 1	.17411.3		.098016
42	015538	159701	005829		011274	.086742
43	009636	169337	047235		010004	.076738
44	029000	198337	.052314	.173363		.096375
45	.058410	139927	.000771	.174134		.101857
46	020337	160264	.047407		000031	.101826
47	060421	220685	029364		003533	.098293
48	007608	228293	016695	.175482		.113636
70	.007000	• 22 02 /3	*******	1113402	* U 1 J J J J J	• • • • • • • • • • • • • • • • • • • •

```
49
     -.00 210 5
                           -.031217
                -.230398
                                       .144265
                                               -.000629
                                                          . 114265
50
                            .020861
      .01 1445
                -.218953
                                       .165126 0.
                                                          .114265
 51
                            .024937
      .003822
                -.215131
                                       .190063 -.008055
                                                          .106210
 52
                           -.010121
     -.029666
                -.244797
                                       .179942
                                                .009759
                                                          .115969
                            .051695
                                       .231637
 53
     -.003844
                -.248641
                                                .013902
                                                           .129870
                             .037210
 54
      .004110
                -.244531
                                       .268847 -.004220 =
                                                          .125650
 55
                -.216484
                           -.093862
                                       .174985 -.009584
      .028047
                                                           .116066
                           -.023889
                -.205693
                                       .151096
                                                .010165
 56
      .010791
                                                           .126231
                           -.037320
                                       .113775 -.009242
 57
                -.251186
     -.045493
                                                           .116989
                           -.028628
                                       .085147 -.009614
      .017412
                -.233774
                                                           .107375
 58
                           -.024191
                                       .060956
 59
      .029817
               -.203957
                                                .025665
                                                           .133040
                             .007681
                                       .068637 -.015892
                                                          .117148
      .000365
                -.203592
 60
Estimated day of release of auditors report is day 31.
```

#### APPENDIX G

THE MARKET MODEL : A SUMMARY.

If Rit (return on any security) and Rmt (return on a "market" portfolio of all securities) are bivariate normal, then the expected value of Rit conditional on Rmt, is

- (1)  $\mathbb{E}(\mathbb{R}_{i,t} \mid \mathbb{R}_{mt}) = \alpha_i + \beta_i \mathbb{R}_{mt}$ ,  $t=1,\ldots,T$ , with
- (2)  $\beta_i = \text{cov}(R_{it}, R_{mt}) / \delta^2(R_{mt})$  and  $\alpha_i = E(R_{it}) \beta_i E(R_{mt})$ ,  $t = 1, \dots, T$ .

The relationship between  $R_{it}$  and  $R_{mt}$  can then be written as

(3)  $R_{it} = x_i + \beta_i R_{mt} + e_{it}$ , t = 1, ..., T.

Intuitively,  $\kappa_i + \beta_i R_{mt}$  is the component of  $R_{it}$  that can be attributed to the relationship between  $R_{it}$  and  $R_{mt}$ , while  $e_{it}$  is the disturbance in this relationship.

The properties and assumptions of the above equation are as follows:

- (5)  $\sigma^2(e_{it}) = \sigma^2(e_i)$ , t=1,...,T,
- (6)  $cov(e_{it}, R_{mt}) = 0$  t=1, ..., T.

the subscript t will be dropped, henceforth, by assuming that the joint distribution of  $R_{it}$  and  $R_{mt}$  is stationary.

From (6), eit and Rmt are independent, and the variance

of equation (3) can, therefore, be written as

(7) 
$$\sigma^{2}(R_{i}) = \beta_{i}^{2} \sigma^{2}(R_{m}) + \sigma^{2}(\epsilon_{i})$$

Dividing (7) by  $\sigma^2(R_i)$  yields

(8) 
$$1=\beta_1^2 \sigma^2(R_m)/\sigma^2(R_L)+\sigma^2(e_L)/\sigma^2(R_L)$$

Since the correlation coefficient between R;

 $R_m$  is  $p_{im} = cov(R_i, R_m)/\delta(R_i)\delta(R_m)$  and

given the definition of  $\beta_i$  in equation (2), equation (8)

can be rewritten as

(9)  $1=p_{im}^2 + \sigma^2(e_i)/\sigma^2(R_i)$ 

pim is, therefore, the proportion of the variance of

attributed to the relationship between Ri

 $R_{m}$ , while  $1-p_{im}^{2}$  is the proportion of  $R_{i}$ 

attributed to the disturbance term e; .

#### APPENDIX H

DISCRIMINANT FUNCTIONS: THE THEORY.

In this thesis, firms are either assigned to group 1 (the bankrupt firms) or group 2 (the non-bankrupt firms). A kx1 vector x (of financial ratios) is observed for each firm. The individual firms whose measurements are given by x are then assigned to either group 1 or group 2. If the parameters of the distributions of x in 1 and 2 are known, this can be used construct an assignment rule. Otherwise, the sample estimates of the parameters are used. One criterion of goodness classification is that of Fisher, who suggested the use of a linear combination of the observations, and choosing coefficients so that the ratio of the difference of the means of the linear combination in the two groups to its variance maximized.

Let us denote the linear combination as  $y=\beta^*x$ . The mean of y is  $\beta^*u$ , in group 1 and  $\beta^*u$ , in group 2. Assuming that the covariance matrices are the same, that is,  $\angle z = \angle z = \angle z$ , the variance of either population is therefore,  $\beta^* \angle \beta$ .

Fisher's rule is to maximize  $\phi = (\beta^* u_1 - \beta^* u_2)^2 / \beta^* \le \beta$  by choosing  $\beta$ . We therefore differentiate  $\phi$  with respect to  $\beta$ ;

$$\frac{\partial \phi}{\partial \beta} = \frac{2(\mathbf{u}_1 - \mathbf{u}_2)\beta^* \mathbf{\xi} \beta - 2\mathbf{\xi} \beta (\beta^* \mathbf{u}_1 - \beta^* \mathbf{u}_2)}{(\beta^* \mathbf{\xi} \beta)^2} = 0$$

This gives  $u_1 - u_2 = \xi \beta ((\beta^* u_1 - \beta^* u_2) / \beta^* \xi \beta)$ 

As  $\beta$  is used only to separate the population into the two

groups, it can be multiplied by any constant.  $\beta$  is thus proportional to  $\underline{z}'(u_1-u_2)$ . When the population parameters are not known, we can estimate them by  $\overline{x}_1$ ,  $\overline{x}_2$  and S.  $\overline{x}_2$  is the sample mean vector of group i and S is the sample covariance. An alternative derivation is shown in Anderson (1958, pp. 133-134). An individual firm is assigned to group 1 if  $y=(\overline{x}_1-\overline{x}_2)^*S^*x$  is closer to  $\overline{y}_1=(\overline{x}_1-\overline{x}_2)^*S^*\overline{x}_1$ , then to  $\overline{y}_2$  and to group 2 otherwise.

The above assignment rule can also be expressed (equivalently) in the following manner:

Group 1 if  $(\vec{x}_1 - \vec{x}_2) \cdot S^{-1}x - 1/2 (\vec{x}_1 + \vec{x}_2) \cdot S^{-1} (\vec{x}_1 - \vec{x}_2) \leqslant \log k$ Group 2 if  $(\vec{x}_1 - \vec{x}_2) \cdot S^{-1}x - 1/2 (\vec{x}_1 + \vec{x}_2) \cdot S^{-1} (\vec{x}_1 - \vec{x}_2) > \log k$ 

where k is given by k=(p1)(c1)/(p2)(c2). p1 and p2 are the probabilities that a firm belong to group 1 or group respectively. c1 and c2 are the cost of type I and type II written as also be respectively. This can Z=log(p1)(c1)/(p2)(c2); where Z is the discriminant function cut-off score (with an intercept). Under the special case when p1=p2 and c1=c2, k=1 and Z=0. Differences in p1 and p2 and/or c1 and c2 can be used to establish defferent cut-off scores, as illustrated in Chapter 3 of this thesis.

Note: Proof that k=(p1)(c1)/(p2)(c2) is the cut-off score. The conditional probability of a firm coming from Group 1, given an observation x is

p1q1(x)/p1q1(x)+p2q2(x) where qi is the density of population group i. The total expected cost of misclassification is  $c1p1 \int_{R_1}^{R_1} q1(x) dx + c2p2 \int_{R_1}^{R_2} q2(x) dx \quad \text{where} \quad \text{Ri} \quad \text{is} \quad \text{the} \quad \text{region} \quad \text{of} \quad R_1$ 

classification of firms to group i. To minimize the total expected cost of misclassification above, the following R1 and R2 are chosen:

R1:c1p1q1(x) 3c2p2q2(x)

R2:c1p1q1(x) < c2p2q2(x)

This can be rewritten as

R1:c1p1/c2p2 > g2(x)/g1(x)

R2:c1p1/c2p2 < g2(x)/g1(x)

By letting g2(x)/g1(x)=k, we have, therefore, established c1p1/c2p2=k as the cut-off score.

#### APPENDIX I

AN EXAMPLE OF A "SUBJECT TO" OPINION.

## Report of Certified Public Accountants

The Board of Directors XYZ, Inc.

Seattle, Washington

We have examined the balance sheet of XYZ, Inc. as of April 29, 1978, and April 30, 1977, and the related statements of operations and retained earnings and changes in financial position for the year then ended. Our examinations were made in accordance with generally accepted auditing standards and, accordingly, included such tests of the accounting records and such other auditing procedures as we considered necessary in the circumstances.

The Company has incurred significant losses during the two years ended April 29, 1978 and has experienced a significant reduction in working capital during the current year. Accordingly, the Company's ability to realize its assets and retire its liabilities in the normal course of business is dependent upon the Company's obtaining additional financing, as described in Note 13, or achieving profitable operations.

In our opinion, subject to the favorable resolution of the matters discussed in the preceding paragraph, the financial statements designated above present fairly the financial position of XYZ, Inc. at April 29, 1978, and April 30, 1977, and the results of its operations and changes in its retained earnings and financial position for the year then ended, in conformity with generally accepted accounting principles applied on a consistent basis.

Big Eight & Co.

Seattle, Washington June 17, 1978