PhD Training Session at Bangor Business School: Analysing Annual Report Narratives 2 December 2014, Bangor

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ANCASTER JNIVERSITY Management School

Computer-based Analysis of UK Annual Report Narratives

Research funded by ESRC and ICAEW

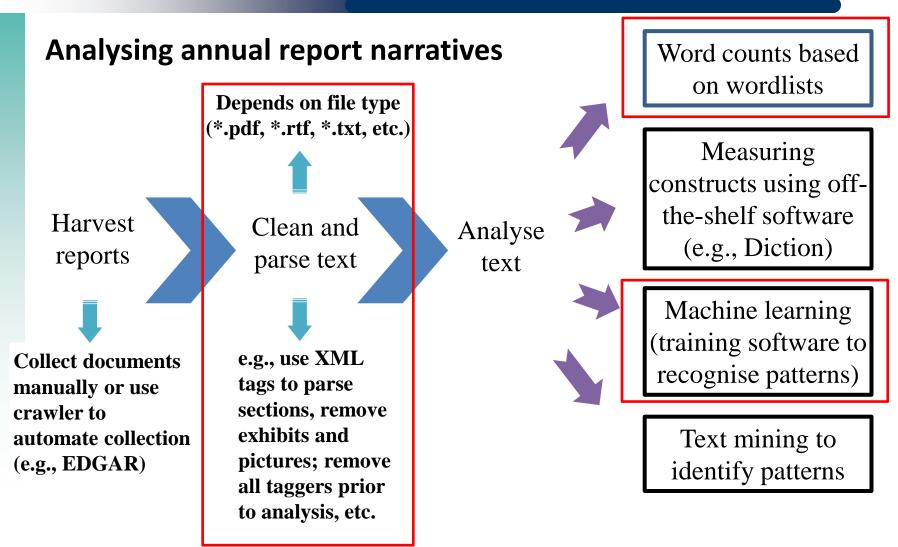




Background & objectives

- Part of an ESRC- and ICAEW-funded project examining the *Corporate Financial Information Environment*
 - Martin Walker, Manchester Business School
 - Steven Young, Lancaster University Management School
 - Paul Rayson, Lancaster University School of Computing & Communications
 - Mahmoud E-Haj, Lancaster University School of Computing & Communications
 - Vasiliki Athanasakou, *London School of Economics*
- Project seeks to analyse UK financial narratives, their association with financial statement information, and their informativeness for investors
- Automated, large sample analysis of UK annual report narratives represents a cornerstone of the project
 - Develop software for general use by academics







Extant research

- Majority of <u>large sample</u> analysis of annual report narratives has been conducted on US filings (10-Ks) available via EDGAR
 - Management Discussion and Analysis (MD&A) section (Item 7)
 - Risk-related disclosures (Item 1A and Item 7A)
 - Entire 10-K filing
- Analysis of 10-K filings in EDGAR is relatively straightforward
 - Plain text files with consistent structure
 - Use HTML/XML taggers to identify section(s) and extract text
- UK annual reports pose more significant challenges to researchers
 - Normally supplied as *.pdf
 - Unstructured format \rightarrow no consistent template



EDGAR 10-K format extract

PART I

- ITEM 1 Description of Business
- ITEM 1A. Risk Factor
- ITEM 1B. Unresolved Staff Comments
- ITEM 2. Description of Properties
- ITEM 3. Legal Proceedings
- ITEM 4. Mine Safety Disclosures

PART II

- ITEM 5. Market for Registrant's Common Equity, Related Stockholder Matters and Issuer Purchases of Equity Securities
- ITEM 6. Selected Financial Data
- ITEM 7. Management's Discussion and Analysis of Financial Condition and Results of Operations
- ITEM 7A. Quantitative and Qualitative Disclosures About Market Risk
- ITEM 8. Financial Statements and Supplementary Data
- ITEM 9. Changes in and Disagreements With Accountants on Accounting and Financial Disclosure
- ITEM 9A. Controls and Procedures
- ITEM 9B. Other Information



EDGAR 10-K example

PART III

- ITEM 10. Directors, Executive Officers and Corporate Governance
- ITEM 11. Executive Compensation
- ITEM 12. Security Ownership of Certain Beneficial Owners and Management and Related Stockholder Matters
- ITEM 13. Certain Relationships and Related Transactions, and Director Independence
- ITEM 14. Principal Accounting Fees and Services

PART IV

ITEM 15. Exhibits, Financial Statement Schedules Signatures



EDGAR 10-K example

<P style="font-family:times;text-align:justify">

 ITEM 1. BUSINESS
 </P> <P ALIGN="CENTER" style="font-family:times;"> GENERAL DEVELOPMENT OF BUSINESS </P>

<P style="font-family:times;text-align:justify">

<P ALIGN="CENTER" style="font-family:times;"> FINANCIAL INFORMATION RELATING TO INDUSTRY SEGMENTS, GEOGRAPHIC AREAS, AND CLASSES OF SIMILAR PRODUCTS

<P style="font-family:times;text-align:justify">

<P ALIGN="CENTER" style="font-family:times;"> NARRATIVE DESCRIPTION OF BUSINESS </P>

<P style="font-family:times;text-align:justify">

<P style="font-family:times;text-align:justify">

October 19, 2011, Abbott announced that it plans to separate into two publicly traded companies, one in diversified medical products and the other in research-based pharmaceuticals. The diversified medical products company will consist of Abbott's existing diversified medical products portfolio, including its branded generic pharmaceutical, devices, diagnostic and nutritional businesses, and will retain the Abbott name. The research-based pharmaceutical company will include Abbott's current portfolio of proprietary pharmaceuticals and biologics and will be named later. </P>



UK Annual report tool: Extraction

- Use contents page to extract text by section from digital pdf
- Steps in extraction process:
 - Detect contents page
 - Parse contents page
 - Detect page numbering to determine section start/end
 - Add headers as bookmarks to pdf
 - Extract text for each section
- Analyse extracted text by section and for entire document

Contents

Chairman's Statement	02
Chief Executive's Statement	05
Finance Director's Review	08
Directors	12
Directors' Report	13
Corporate Governance	15
Independent Auditors' Report	20
Consolidated Income Statement	22
Consolidated Balance Sheet	23
Company Balance Sheet	24
Consolidated Statement of Recognised Income and Expense	25
Consolidated Reconciliation of Movements in Equity	25
Company Statement of Recognised Income and Expense	25
Company Reconciliation of Movemen	ts in Equity 25
Consolidated Cash Flow Statement	26
Company Cash Flow Statement	26
Notes to the Financial Statements	27
Board Report on Directors' Remunera	ation 54
Notice of Annual General Meeting	58
Shareholder Information	59
Group Five Year Record	60
Corporate Information	Inside Back Cover



UK Annual reports: Unstructured format

Contents

- IFC Financial and operating highlights
- 02 Chairman's statement
- 04 Chief executive's report
- 08 Performance review
- 26 Corporate social responsibility report
- 32 Board of directors and company secretary
- 33 Directors' report
- 36 Corporate governance report
- 42 Directors' remuneration report
- 54 Statement of directors' responsibilities
- 55 Independent auditors' report Group

- 56 Consolidated income statement
- 57 Consolidated balance sheet
- 58 Consolidated cash flow statement
- 59 Reconciliation of net cash flow to movements in net debt Consolidated statement of recognised income and expense Consolidated statement of changes in equity
- 60 Notes to the consolidated financial statements
- 99 Independent auditors' report Company
- 100 Company balance sheet

- 101 Company cash flow statement Company statement of recognised income and expense Company statement of changes in equity
- 102 Notes to the Company financial statements
- 112 Five year record
- 113 Shareholder analysis
- 114 Financial calendar Company information
- 115 Investor information
- 116 Principal operations

Financial highlights:

- > Continuing profit before taxation* up 25.3% at £50.1m (2006/07: £40.0m)
- > Profit for the period £34.5m (2006/07: loss £22.5m)
- > Adjusted EPS¹ 20.9% ahead at 7.88p (2006/07: 6.52p)
- Strong cash management continues to drive low net debt² at £200.2m (2006/07: £174.2m)
- > Robust balance sheet continuation of share buy-back programme in 2008/09
- > Proposed dividend up 5.9% at 4.50p (2006/07: 4.25p)



UK Annual reports: Unstructured format (cont'd)

What's in our report





Sir lan Gibson A clear strategy is in place that We are committed to making food shopping fresh, friendly is delivering our objectives. and affordable MI Page 4 MI Page 2





Richard Pennycook Our strong financial performance positions us well for sustainable long term drowth. MI Page 8

Corporate responsibility

Investor relations website www.morrisons.co.uk/corporate

Also see

review 2011/12

remain key principles. DI Page 46

Annual review

2011/12

Johanna Waterous A strong performance culture, long term shareholder value and competitive positioning

Governance Board of Directors and Management Board 40 Corporate governance report Directors' remuneration report 46 56 General information 59

Statement of Directors' responsibilities

Directors' report and business review

Chairman's statement Business and strategy review

Key performance indicators

Risks and uncertainties

Corporate responsibility

Chief Executive's business and strategy review Group Finance Director's financial review Our strategic objectives

Introduction

Performance review

Our people

12

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33

Financial statements

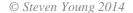
1.81.271		out the second
0	Group	p financial statements
	60	Independent auditor's report
	61	Consolidated statement
		of comprehensive income
	62	Consolidated balance sheet
	63	Consolidated cash flow statement
	64	Consolidated statement of changes in equ
	65	Group accounting policies
	70	Notes to the Group financial statements
5	Comp	any financial statements
	95	Company balance sheet

in equity

- 96
- Company accounting policies 99 Notes to the Company financial statements

Investor information

- 108 Five year summary of results
- 109 Supplementary information
- 110 Investor relations and financial calendar





UK Annual report tool: NLP

- In addition to performing text extraction, the tool provides a range of text analysis options:
 - Readability metrics
 - Word counts using pre-determined lists (e.g., forward looking, uncertainty, tone, etc.)
 - Word counts based on user-defined wordlists
 - Comparison with reference corpus (word level and semantic level)
 - Concordance and collocates
 - Upload and analyse user-defined text file
- Demo to illustrate functionality \rightarrow



UK Annual report tool: Demo overview

- Overview (wordlists, readability metrics) and interface with WMatrix
- Uploading one or more annual reports and generating output
- Uploading and analysing with a user-defined key word list
- Uploading and analysing a user-defined text file
- Examples of further analysis in MWatrix:
 - Cloud for chairman's statement vs. standard reference corpus: word level
 - Cloud for chairman's statement vs. to standard reference corpus: semantic level
 - Cloud for chairman's statement vs. chairman's statement corpus: word level
 - Cloud for chairman's statement vs. chairman's statement corpus: semantic level
 - Concordance/colocation



UK Annual report tool: Developments

- The tool also offers the following features:
 - Choice of different readability metrics
 - Text re-use metric to detect boilerplating and incremental changes
 - Method for splitting "front end" and "back end" of the annual report
 - Method for isolating performance commentary (e.g., CEO Review/Business Review/Operating Review/Financial Review)
 - Reference corpora for:
 - Full Annual Report and Accounts
 - Chairman's Statement
 - CEO Review/Business Review/Operating Review/Financial Review
 - Corporate Governance
 - Directors' Remuneration
 - Readability scores for all UK annual reports for the period 2003-2014
 - Method for linking scores to financial and market data from Datastream



UK Annual report tool

Questions?

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Appendix: Identifying and parsing the contents page

- Identifying and extracting the AR contents page creates a number of challenges
 - Location and format of the contents table is entirely at the discretionary of management → rarely positioned at the beginning of the document (i.e. p.1)
 Solution: use a matching algorithm based on set of words and phrases common to tables of contents



Appendix: Identifying and parsing the contents page

- Identifying and extracting the AR contents page creates a number of challenges
 - Location and format of the contents table is entirely at the discretionary of management → rarely positioned at the beginning of the document (i.e. p.1)
 Solution: use a matching algorithm based on set of words and phrases common to tables of contents
 - Widespread practice of presenting other text such as company overview and performance highlights on the same page as the table of contents
 Solution: extract lines of text from the contents page that start or end with a number between one and the number of pages in the AR



Appendix: Identifying and parsing the contents page

- Identifying and extracting the AR contents page creates a number of challenges
 - Location and format of the contents table is entirely at the discretionary of management → rarely positioned at the beginning of the document (i.e. p.1)
 Solution: use a matching algorithm based on set of words and phrases common to tables of contents
 - Widespread practice of presenting other text such as company overview and performance highlights on the same page as the table of contents
 Solution: extract lines of text from the contents page that start or end with a number between one and the number of pages in the AR
 - Page numbers referenced in the published table of contents rarely align with page numbers in the PDF

Solution: use an algorithm that crawls through a dynamic set of 3 pages to identify a pattern of sequential numbers with increment one (e.g. 31, 32, 33)



Appendix: Booklet-style annual reports

- Some ARs are published with two report pages (portrait orientation) presented side-by-side on a single page (landscape orientation) in the PDF
 - Booklet-style ARs compound the problem of page number misalignment because two pages in the annual report equate to a single page in the PDF
 Solution: unable to devise a reliable algorithm to resolve this pagination problem



Appendix: Booklet-style annual reports

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 - Booklet-style ARs compound the problem of page number misalignment because two pages in the annual report equate to a single page in the PDF
 Solution: unable to devise a reliable algorithm to resolve this pagination problem
- Absent a solution for resolving this problem we create a flag to identify possible booklet-style (ARs) → allows user to exclude suspect reports
- Use two conditions to classify annual reports as booklet-style candidates:
 - Cases where a contents header including the keywords "notes to" or "notes relating to" corresponds to a page number > number of pages in the PDF file
 - Page width in PDF file > 800 points



Appendix: Treatment of image-based PDFs

- Most U.K. firms now provide their AR as a digital PDF file
 - But prior to 2006, a non-trivial fraction of ARs were supplied as image-based (i.e., scanned) PDFs
 - Text extraction methods cannot be applied to image-based PDF files
- Sought to remedy this problem by converting all image-based files to digital format using optical character recognition (OCR) techniques
- Problem: tests revealed that OCR does not convert text in a way that permits tables of contents to be parsed reliably
 - While converted tables of contents appear to be structured appropriately, actual flow of text often reads down a column rather than across each row
- Inability to process image-based PDFs biases against smaller firms before 2006



Appendix: Distinguishing narratives from financial statements

- Primary focus relates to the narrative component of the AR
 - Isolating the narrative element is a non-trivial task due to the lack of standardization with respect to the ordering and labelling of section headers
- Use a two-step approach that involves:
 - A preliminary split based on the structure of a representative U.K. annual report;
 - Followed by an updating process that accounts for deviations from our representative case



Appendix: Distinguishing narratives from financial statements

1.	Section	Comments
2.	Overview	(including highlights)
3.	Chairman's statement	
4.	Performance commentary	(including one or more of the following sections: chief executive's review, review of operations, business review, strategic review, financial review)
5.	Other sections	(various, common examples of which include risk review and corporate social responsibility report)
6.	Director's biographies	
7.	Directors' report	
8.	Governance statement	
9.	Remuneration Report	
10.	Statement of directors' responsibilities	
11.	Auditor's report	
12.	Primary financial statements	(as required by IAS 1)
13.	Notes to the accounts	(as required by IAS 1)
14.	Other disclosures	(various, common examples of which include notice of annual general meeting, three- or five-year review, subsidiaries and operating locations, etc.)



2014

2005 financial highlights IFC 1. Who we are 01 02 A short voyage around our business Number one UK ports operator 04 Long-term, blue chip customers 06 Almost a quarter of the UK's seaborne trade 07 Our markets 08 Investment programme 14 Generating revenue from coal 16 Immingham Outer Harbour 18 Hull shortsea container terminal 20 Sizeable returns from 22 smaller investments 24 2. How we have performed Chairman's statement 26 Group Chief Executive's review 28 of strategy Operating and financial review 32 50 3. How our results add up 52 Group income statement 53 Balance sheets 54 Cash flow statements Statement of recognised income and expense 55 Notes to the financial statements 56 How we behave 96 Board of directors 100 Operational management team 102 Statement of directors' responsibilities 104 Independent auditors' report 105 Directors' report 106 108 Corporate governance Remuneration report 118 Shareholder analysis 129 Corporate social responsibility 130 Notice of meeting 134 Five-year summary 136 Company information 138 140 Glossary

FURTHER DETAILS ON METHODOLOGY

Example

2005 financial nighlights	IFG	
1. Who we are	01	
A short voyage around our business	02	
Number one UK ports operator	04	
Long-term, blue chip customers	06	•
Almost a quarter of the UK's		
seaborne trade	07	_
Our markets	08	
Investment programme	14	
Generating revenue from coal	16	_
Immingham Outer Harbour	18	-
Hull shortsea container terminal	20	•
Sizeable returns from		•
smaller investments	22	
2. How we have performed	24	
Chairman's statement	26	
Group Chief Executive's review		
of strategy	28	_
Operating and financial review	32	_
2 How our populte odd up	50	
Group incomo statomont	<u>E2</u>	
Palance cheete	53	
Cast from clairs resile		
Statement of recognized income		
and expense	55	
Notes to the final cial statements		
4. How we behave	98	
Board of directors	100	
Operational management team	102	

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Appendix: Isolating performance commentary

- Performance commentary is a particularly important category of the narrative section of U.K. ARs
 - Equivalent to Item 7: Management Discussion and Analysis (MD&A) in 10-K
- Unlike 10-K filings, structure and format of performance reporting in U.K. ARs is largely discretionary
 - Some firms limit performance commentary to a statement by the CEO reviewing operational matters and a report by the CFO on financial
 - Majority of firms decompose performance-related discussions across multiple sections with non-standard headings
- Use an algorithm that harvests all sections between pre-specified start (s) and end (e) points based on the representative AR structure
 - Supplementary adjustments to deal with reports that deviate from the base case
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Appendix: Isolating performance commentary

	1.	Section	Comments
	2.	Overview	(including highlights)
$S \rightarrow$	3.	Chairman's statement	
	4.	Performance commentary	(including one or more of the following sections: chief executive's review, review of operations, business review, strategic review, financial review)
	5.	Other sections	(various, common examples of which include risk review and corporate social responsibility report)
ſ	6.	Director's biographies	
	7.	Directors' report	
e j	8.	Governance statement	
	9.	Remuneration Report	
	10.	Statement of directors' responsibilities	
	11.	Auditor's report	
	12.	Primary financial statements	(as required by IAS 1)
	13.	Notes to the accounts	(as required by IAS 1)
	14.	Other disclosures	(various, common examples of which include notice of annual general meeting, three- or five-year review, subsidiaries and operating locations, etc.)



	2005 financial highlights	IFC	
	1. Who we are	01	
	A short voyage around our business	02	-
	Number one UK ports operator	04	-
	Long-term, blue chip customers	06	
	Almost a quarter of the UK's		-
	seaborne trade	07	_
	Our markets	08	
	Investment programme	14	_
	Generating revenue from coal	16	
	Immingham Outer Harbour	18	
	Hull shortsea container terminal	20	
	Sizeable returns from		-
	smaller investments	22	_
	2. How we have performed	24	
$S \rightarrow$	Chairman's statement	26	
~	Group Chief Executive's review		-
	of strategy	28	
	Operating and financial review	32	-
	3. How our results add up	50	
	Group income statement	52	
	Balance sheets	53	
	Cash flow statements	54	
	Statement of recognised income		
	and expense	55	
	Notes to the financial statements	56	
	4. How we behave	96	
$e \rightarrow$	Board of directors	100	-
•	Operational management team	102	-
	Statement of directors'		
	responsibilities	104	
	Independent auditors' report	105	-
	Directors' report	106	
	Corporate governance	108	
	Remuneration report	118	-
	Shareholder analysis	129	-
	Corporate social responsibility	130	-
	Notice of meeting	134	-
	Five-year summary	136	-
	Company information	138	-
	Glossary	140	2014
			-

Example

Group Chief Executive's review	
of strategy	28
Operating and financial review	32

5. Now our results add up	1000
	177 (A)
Group income statement	1.102.
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Statement of recognised income	
and expense	55
and a second	100.00
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ANALYSIS OF STRATEGY-RELATED CONTENT

Summary

- Automated large sample analysis of non-US annual reports is hampered by format and structure
- Develop a free-to-access software tool for extracting and analysing UK annual report narratives (plus text from other sources)
 - Extracts from pdfs by section
 - Provides simple NLP metrics such as readability, word counts, etc.
 - Interfaces with MWatrix for more sophisticated linguistic analysis at parts of speech and semantic levels
- Functionality of software expected to develop significantly over coming months
- Using methods to examine a series of disclosure-related questions