# Media in Context Traditional Media Codebook

February 17, 2017

## 1 Data and methods

#### 1.1 Data collection

The outlet-by-day dataset contains 135 variables and 2826 observations, corresponding to 27 media outlets - 17 newspapers, 9 TV and 1 radio. See variable 6 outlet\_id for the list of media outlets.

The analysed period is between 1 February 2015 and 30 May 2015.

Newspaper articles published between 1 February 2015 and 30 May 2015 were downloaded from the Nexis UK database. A subset of 11,000 articles were human-coded and labeled as either being about the UK General Elections or not. The labeled articles were used to train a supervised classifier in order to identify election articles in the rest of the corpus. A linear support vector machines classifier was trained using a stochastic gradient descent algorithm (F-score=0.95), which predicted 21,038 articles to be about the elections.

TV and radio news transcripts were downloaded using Box of Broadcats, the on-demand TV and radio service for education.

The total number of articles, TV and radio shows based on which this dataset was compiled is 22,947. These units were processed using quantiative text analysis techniques, and the results were aggregated at the outlet-day level.

## 1.2 Methods

Mentions of leaders and parties were measured using the party and leader names as keywords.

The tone, positive and negative emotions variables were measured using the psychological dictionaries developed by Pannebaker et al.(2015) and included in the Linguistic Inquiry and Word Count (LIWC2015) software.

The main topics were computed using a Latent Dirichlet Allocation (LDA) model (Blei et al. 2003; Griffiths and Steyvers, 2004). LDA is simple hierarchical Bayesian model of text based on the following assumptions: 1) each word in a text is exchangeable, each text in a corpus is a combination of a specific number of topics, and each specific topic is represented as a distribution of words over a fixed vocabulary. The generative structure that produces each document in a corpus is represented as random mixtures of latent topics and their associated distributions of words. We estimate the model using the sparse Gibbs sampler described in Yao et al. (2009) and the hyperparameter optimization routine utilized in Wallach et al. (2009).

Label	Keys
Business	govern busi energi power citi plan green compani work industri
Conservative	minist secretari tori cameron prime cabinet common parliament elect govern
Debates	debat leader cameron miliband bbc parti david question broadcast farag clegg
Economy	osborn economi econom govern budget chancellor elect growth market britain
Employment	work labour job tori countri vote live hour govern cameron
EU	cameron referendum britain vote govern european europ minist union power
ForeignAffairs	state islam govern countri syria presid report forc british britain
Green	vote parti elect polit green voter candid campaign poll gener
Housing	hous home buy properti rent london build council associ tenant
Immigration	immigr migrat rahman migrant elect britain net british power commun
Labour	labour parti leader leadership miliband union shadow elect secretari candid
LibDem	lib dem parti clegg liber nick democrat coalit seat tori
Media	block publish updat twitter cameron photograph guardian shapp conserv interview
NHS	health servic care women hospit patient fund doctor staff govern
Polls	poll labour cent tori seat parti vote conserv elect voter
Regions	labour seat candid vote london tori conserv elect west constitu
Schools	school wale educ welsh student govern univers plaid labour fee
SNP	snp scotland scottish labour sturgeon parti nicola vote leader murphi
SNPCoalition	labour snp govern parti miliband vote deal tori elect coalit
SocialIssues	famili life church children live sunday mother women father young
TaxSpend	tax cut spend plan labour billion budget pension incom benefit
UKIP	ukip farag parti nigel leader elect thanet south campaign support

## 2 Variable description

## 2.0.1 Metadata

- 1. day
  - Day, integer 01-31.
- 2. month Month, integer 02-05.
- 3. date Date Stata format.
- 4. date\_str
  - Date, string.
- 5. weekday
  - Day of the week, string, Monday-Sunday.
- 6. outlet\_id
  - MiC outlet id:
    - 1 Daily/Sunday Express
    - 2 Daily Mail/Mail on Sunday
    - 3 Daily Mirror/Sunday Mirror
    - 4 Daily Star/Daily Star Sunday
    - 5 Financial Times
    - 6 Guardian/Observer
    - 7 Independent/Independent on Sunday

- 9 The Sun
- 10 Times/Sunday Times
- 11 Birmingham Evening Mail
- 12 Daily Record/Sunday Mail
- 13 Evening Standard
- 14 Scotsman/Scotland on Sunday
- 15 Western Mail/Mail on Sunday
- 16 Western Morning News
- 17 BBC1 News at 10
- 18 Newsnight
- 19 ITV News at 10
- 20 Channel 4 News
- 21 Channel 5 News
- 22 Sky News at Ten
- 23 BBC Radio 4 Today
- 24 BBC London News
- 27 BBC Reporting Scotland
- 29 BBC Wales Today
- 71 Daily Telegraph/Sunday Telegraph
- 72 Yorkshire Evening Post
- 7. outlet\_name
  - Outlet name.
- 8. media\_type Type of media (newspaper, TV, radio).
- 9. unit\_of\_analysis Unit of analysis.

## 2.0.2 Proportions of party and leader mentions by day

10. total\_size

Average number of words post-processing. Each unit (TV show, radio show or article) was processed by removing punctuation and common English stopwords. The number of words in clean units was averaged by outlet-day.

- 11. con\_mention Proportion Conservative mentions out of variable 10 total\_size.
- 12. lab\_mention Proportion Labour mentions out of variable 10 total\_size.
- 13. ld\_mention

Proportion Lib Dem mentions out of variable 10 total\_size.

14. snp\_mention

Proportion SNP mentions out of variable 10 total\_size.

- 15. pc\_mention Proportion Plaid Cymru mentions out of variable 10 total\_size.
- 16. ukip\_mention Proportion UKIP mentions out of variable 10 total\_size.
- 17. green\_mention Proportion Green mentions out of variable 10 total\_size.

- 18. cameron
  - Proportion Cameron mentions out of variable 10 total\_size.
- 19. miliband Proportion Miliband mentions out of variable 10 total\_size.
- 20. clegg Proportion Clegg mentions out of variable 10 total\_size.
- 21. sturgeon Proportion Sturgeon mentions out of variable 10 total\_size.22. wood Proportion
  - Wood mentions out of variable 10 total\_size.
- 23. farage ProportionFarage mentions out of variable 10 total\_size.
- 24. bennett Proportion Bennett mentions out of variable 10 total\_size.

## 2.0.3 Party and leader sentiment

- 25. words\_overall Average number of words in the original text.
- 26. tone\_overall

Average overall tone, measured using LIWC2015.

- 27. posemo\_overall Average positive emotion, measured using LIWC2015.
- 28. negemo\_overall Average negative emotion, measured using LIWC2015.
- 29. con\_words

Average number of words in Conservative segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

30. con\_tone

Average tone (LIWC2015) in conservative segment.

31. con\_posemo

Average positive emotion (LIWC2015) in conservative segment.

32. con\_negemo

Average negative emotion (LIWC2015) in conservative segment.

33. lab\_words

Average number of words in Labour segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

34. lab\_tone

Average tone (LIWC2015) in segment.

35. lab\_posemo

Average positive emotion (LIWC2015) in segment.

- 36. lab\_negemo Average negative emotion (LIWC2015) in segment.
- 37. libdem\_words

Average number of words in Lib Dem segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

38. libdem\_tone

Average tone (LIWC2015) in Lib Dem segment.

- 39. libdem\_posemo Average positive emotion (LIWC2015) in Lib Dem segment.
- 40. libdem\_negemo Average negative emotion (LIWC2015) in Lib Dem segment.
- 41. snp\_words

Average number of words in SNP segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

42. snp\_tone

Average tone (LIWC2015) in SNP segment.

43. snp\_posemo

Average positive emotion (LIWC2015) in SNP segment.

44. snp\_negemo

Average negative emotion (LIWC2015) in SNP segment.

45. pc\_words

Average number of words in Plaid Cymru segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

46. pc\_tone

Average tone (LIWC2015) in Plaid Cymru segment.

47. pc\_posemo

Average positive emotion (LIWC2015) in Plaid Cymru segment.

48. pc\_negemo

Average negative emotion (LIWC2015) in Plaid Cymru segment.

49. ukip\_words

Average number of words in UKIP segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

50. ukip\_tone

Average tone (LIWC2015) in UKIP segment.

51. ukip\_posemo

Average positive emotion (LIWC2015) in UKIP segment.

52. ukip\_negemo

Average negative emotion (LIWC2015) in UKIP segment.

53. green\_words

Average number of words in Green segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

54. green\_tone

Average tone (LIWC2015) in Green segment.

55. green\_posemo

Average positive emotion (LIWC2015) in Green segment.

56. green\_negemo

Average negative emotion (LIWC2015) in Green segment.

57. cameron\_words

Average number of words in Cameron segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

- 58. cameron\_tone Average tone (LIWC2015) in Cameron segment.
- 59. cameron\_posemo Average positive emotion (LIWC2015) in Cameron segment.

60. cameron\_negemo Average negative emotion (LIWC2015) in Cameron segment. 61. miliband\_words Average number of words in Miliband segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention. 62. miliband tone Average tone (LIWC2015) in Miliband segment. 63. miliband\_posemo Average positive emotion (LIWC2015) in Miliband segment. 64. miliband\_negemo Average negative emotion (LIWC2015) in Miliband segment. 65. clegg\_words Average number of words in Clegg segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention. 66. clegg\_tone Average tone (LIWC2015) in Clegg segment. 67. clegg\_posemo Average positive emotion (LIWC2015) in Clegg segment. 68. clegg\_negemo Average negative emotion (LIWC2015) in Clegg segment. 69. sturgeon words Average number of words in Sturgeon segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention. 70. sturgeon tone Average tone (LIWC2015) in Sturgeon segment. 71. sturgeon\_posemo Average positive emotion (LIWC2015) in Sturgeon segment. 72. sturgeon\_negemo Average negative emotion (LIWC2015) in Sturgeon segment. 73. wood\_words Average number of words in Wood segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention. 74. wood\_tone Average tone (LIWC2015) in Wood segment. 75. wood posemo Average positive emotion (LIWC2015) in Wood segment. 76. wood negemo Average negative emotion (LIWC2015) in Wood segment. 77. farage\_words Average number of words in Farage segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention. 78. farage\_tone Average tone (LIWC2015) in Farage segment. 79. farage\_posemo Average positive emotion (LIWC2015) in Farage segment. 80. farage\_negemo

Average negative emotion (LIWC2015) in Farage segment.

81. bennett\_words

Average number of words in Bennett segments. Segments were extracted out of the clean text by taking the 20 words before and after the party/leader mention.

- 82. bennett\_tone Average tone (LIWC2015) in Bennett segment.
- 83. bennett\_posemo Average positive emotion (LIWC2015) in Bennett segment.
- 84. bennett negemo Average negative emotion (LIWC2015) in Bennett segment.

#### 2.0.4 Sums of leader and party mentions by day

- 85. total\_units Total units (articles, TV or radio shows) per day. 86. con\_units Total units mentioning Conservatives. 87. lab units Total units mentioning Labour. 88. ld units Total units mentioning Lib Dems. 89. snp\_units Total units mentioning SNP. 90. pc\_units Total units mentioning Plaid Cymru. 91. ukip\_units Total units mentioning UKIP. 92. green\_units Total units mentioning the Greens. 93. cameron\_units Total units mentioning Cameron. 94. miliband units Total units mentioning Miliband. 95. clegg\_units Total units mentioning Clegg. 96. sturgeon units Total units mentioning Sturgeon. 97. wood units Total units mentioning Wood. 98. farage\_units

  - Total units mentioning Farage.
- 99. bennett\_units Total units mentioning Bennett.
- 100. sum\_words\_day Sum of the number of words in the clean text for all units (articles, TV and radio shows) per day.
- 101. con ment
  - Total number of times Conservatives mentioned in an outlet per day.
- 102. lab ment Total number of times Labour mentioned in an outlet per day.

103.	ld_ment
	Total number of times Lib Dems mentioned in an outlet per day.
104.	snp_ment
	Total number of times SNP mentioned in an outlet per day.
105.	pc_ment
	Total number of times Plaid Cymru mentioned in an outlet per day.
106.	ukip_ment
	Total number of times UKIP mentioned in an outlet per day.
107.	green_ment
	Total number of times Greens mentioned in an outlet per day.
108.	cameron_ment
	Total number of times Cameron mentioned in an outlet per day.
109.	miliband_ment
	Total number of times Miliband mentioned in an outlet per day.
110.	clegg_ment
	Total number of times Clegg mentioned in an outlet per day.
111.	sturgeon_ment
	Total number of times Sturgeon mentioned in an outlet per day.
112.	wood_ment
	Total number of times Wood mentioned in an outlet per day.
113.	farage_ment
	Total number of times Farage mentioned in an outlet per day.
114.	bennett_ment
	Total number of times Bennett mentioned in an outlet per day.

#### 2.0.5 Topics

- 115. topic\_conservatives Average Conservative topic proportion per day.116. topic\_labour Average Labour topic proportion per day.
- 117. topic\_libdem Average Lib Dem topic proportion per day.
- 118. topic\_snp Average SNP topic proportion per day.
- 119. topic\_ukip Average UKIP topic proportion per day.
- 120. topic\_green Average Green topic proportion per day.
- 121. topic\_business Average Business topic proportion per day.
- 122. topic\_nhs Average NHS topic proportion per day.
- 123. topic\_taxspend Average Taxation and Spending topic proportion per day.
- 124. topic\_housing Average Housing topic proportion per day.
- 125. topic\_polls

Average Polls topic proportion per day.

- 126. topic\_regions Average Regions topic proportion per day.127. topic\_socialissues
- Average Social Issues topic proportion per day.
- 128. topic\_economy Average Economy topic proportion per day.
- 129. topic\_debates Average Debates topic proportion per day.
- 130. topic\_eu Average EU topic proportion per day.
- 131. topic\_media Average Media topic proportion per day.132. topic\_snpcoalition
- Average SNP Coalition topic proportion per day.
- 133. topic\_schools Average Schools topic proportion per day.
- 134. topic\_employment Average Employment topic proportion per day.
- 135. topic\_foreign Average Foreign Policy topic proportion per day.