1. Title: SPAM E-mail Database

2. Sources:

- (a) Creators: Mark Hopkins, Erik Reeber, George Forman, Jaap Suermondt Hewlett-Packard Labs, 1501 Page Mill Rd., Palo Alto, CA 94304
- (b) Donor: George Forman (gforman at nospam hpl.hp.com) 650-857-7835
- (c) Generated: June-July 1999

3. Past Usage:

- (a) Hewlett-Packard Internal-only Technical Report. External forthcoming.
- (b) Determine whether a given email is spam or not.
- (c) ~7% misclassification error. False positives (marking good mail as spam) are very undesirable. If we insist on zero false positives in the training/testing set, 20-25% of the spam passed through the filter.

4. Relevant Information:

The "spam" concept is diverse: advertisements for products/web sites, make money fast schemes, chain letters, pornography...

Our collection of spam e-mails came from our postmaster and individuals who had filed spam. Our collection of non-spam e-mails came from filed work and personal e-mails, and hence the word 'george' and the area code '650' are indicators of non-spam. These are useful when constructing a personalized spam filter. One would either have to blind such non-spam indicators or get a very wide collection of non-spam to generate a general purpose spam filter.

For background on spam: Cranor, Lorrie F., LaMacchia, Brian A. Spam! Communications of the ACM, 41(8):74-83, 1998.

- 5. Number of Instances: 4601 (1813 Spam = 39.4%)
- 6. Number of Attributes: 58 (57 continuous, 1 nominal class label)

7. Attribute Information:

The last column of 'spambase.data' denotes whether the e-mail was considered spam (1) or not (0), i.e. unsolicited commercial e-mail. Most of the attributes indicate whether a particular word or character was frequently occuring in the e-mail. The run-length attributes (55-57) measure the length of sequences of consecutive capital letters. For the statistical measures of each attribute, see the end of this file. Here are the definitions of the attributes:

48 continuous real [0,100] attributes of type word_freq_WORD = percentage of words in the e-mail that match WORD, i.e. 100 * (number of times the WORD appears in the e-mail) / total number of words in e-mail. A "word" in this case is any string of alphanumeric characters bounded by non-alphanumeric

characters or end-of-string.

- 6 continuous real [0,100] attributes of type char_freq_CHAR
- = percentage of characters in the e-mail that match CHAR,
- i.e. 100 * (number of CHAR occurences) / total characters in e-mail
- 1 continuous real [1,...] attribute of type capital_run_length_average
- = average length of uninterrupted sequences of capital letters
- 1 continuous integer [1,...] attribute of type capital_run_length_longest
- = length of longest uninterrupted sequence of capital letters
- 1 continuous integer [1,...] attribute of type capital_run_length_total
- = sum of length of uninterrupted sequences of capital letters
- = total number of capital letters in the e-mail
- 1 nominal {0,1} class attribute of type spam
- = denotes whether the e-mail was considered spam (1) or not (0),
- i.e. unsolicited commercial e-mail.
- 8. Missing Attribute Values: None
- 9. Class Distribution:

Spam 1813 (39.4%) Non-Spam 2788 (60.6%)

Attribute Statistics:

Min: Max: Std.Dev: Coeff.Var_%: Average: 4.54 0.10455 0.30536 1 292 2 0 14.28 0.21301 1.2906 606 3 0 5.1 0.28066 0.50414 180 4 0 42.81 0.065425 1.3952 2130 5 10 0.31222 0.67251 215 6 0 5.88 0.095901 0.27382 286 7.27 0.39144 7 0 0.11421 343 11.11 0.40107 8 0 0.10529 381 9 0 5.26 0.27862 309 0.090067 10 0 18.18 0.23941 0.64476 269 11 0 2.61 0.059824 0.20154 337 9.67 12 0 0.5417 0.8617 159 13 0 5.55 0.09393 0.30104 320 14 0 10 0.058626 0.33518 572 15 0 4.41 0.049205 0.25884 526 16 0 20 0.82579 0.24885 332 17 0 7.14 0.14259 0.44406 311 18 0 9.09 0.18474 0.53112 287 19 0 18.75 1.6621 1.7755 107 20 0 18.18 0.085577 0.50977 596

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21 0
        11.11
                0.80976
                          1.2008
                                    148
22 0
        17.1
                0.1212
                          1.0258
                                    846
23 0
        5.45
                0.10165
                          0.35029
                                    345
24 0
        12.5
                0.094269
                          0.44264
                                    470
25 0
        20.83
                0.5495
                                    304
                          1.6713
26 0
        16.66
                0.26538
                          0.88696
                                    334
27 0
        33.33
                          3.3673
                                    439
                0.7673
28 0
        9.09
                0.12484
                          0.53858
                                    431
29 0
        14.28
                                    600
                0.098915
                          0.59333
30 0
        5.88
                          0.45668
                                    444
                0.10285
31 0
        12.5
                0.064753
                          0.40339
                                    623
32 0
        4.76
                0.047048
                          0.32856
                                    698
33 0
        18.18
                0.097229
                          0.55591
                                    572
34 0
        4.76
                0.047835
                          0.32945
                                    689
35 0
        20
                0.10541
                          0.53226
                                    505
36 0
        7.69
                0.097477
                          0.40262
                                    413
37 0
        6.89
                0.13695
                          0.42345
                                    309
38 0
        8.33
                0.013201
                          0.22065
                                    1670
39 0
        11.11
                0.078629
                          0.43467
                                    553
40 0
        4.76
                0.064834
                          0.34992
                                    540
41 0
        7.14
                0.043667
                          0.3612
                                    827
42 0
        14.28
                0.13234
                          0.76682
                                    579
43 0
        3.57
                0.046099
                          0.22381
                                    486
44 0
                0.079196
        20
                          0.62198
                                    785
45 0
        21.42
                0.30122
                          1.0117
                                    336
        22.05
46 0
                0.17982
                          0.91112
                                    507
47 0
        2.17
                0.0054445 0.076274 1400
48 0
        10
                0.031869
                          0.28573
                                    897
49 0
        4.385
                0.038575
                          0.24347
                                    631
50 0
        9.752
                0.13903
                          0.27036
                                    194
51 0
        4.081
                0.016976
                          0.10939
                                    644
52 0
        32.478 0.26907
                          0.81567
                                    303
53 0
        6.003
                0.075811
                          0.24588
                                    324
54 0
        19.829 0.044238
                          0.42934
                                    971
55 1
        1102.5 5.1915
                          31.729
                                    611
56 1
        9989
                52.173
                          194.89
                                    374
57 1
        15841
                283.29
                          606.35
                                    214
58 0
                0.39404
                                    124
        1
                          0.4887
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This file: 'spambase.DOCUMENTATION' at the UCI Machine Learning Repository http://www.ics.uci.edu/~mlearn/MLRepository.html