### Data Analysis and Decision Making (Fall 2018)

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Assignment 2 (100 points)

# Problem 1. (50 points)

Using the Default Credit dataset, posted on black board, divide the data into two groups, (i) training data, containing 75% of the observations and (ii) test data, containing the remaining 25% of the observations. Compute the best model using best subset selection, forward, backward, and stepwise regression. Estimate test error and compute the training error. Also report the AIC and adjusted R-square for each model.

## Dataset Description:

This dataset includes customer credit history described by a set of attributes and his background such as age, gender, education, and marital status.

#of observations: 30,000

#of attributes: 24

#### Attribute Information:

## Binary outcome variable:

• default payment (Yes = 1, No = 0), as the response variable.

### **Explanatory variables:**

- X1: Amount of the given credit (dollar)
- X2: Gender (1 = male; 2 = female).
- X3: Education (1 = graduate school; 2 = university; 3 = high school; 4 = others).
- X4: Marital status (1 = married; 2 = single; 3 = others).
- X5: Age (year).
- X6 X11: History of past payment (from April to September, 2005). The measurement scale for the repayment status is: -1 = pay duly; 1 = payment delay for one month; 2 = payment delay for two months; . . .; 8 = payment delay for eight months; 9 = payment delay for nine months and above.
- X12-X17: Amount of bill statement (dollar) (from April to September, 2005).
- X18-X23: Amount of previous payment (dollar) (from April to September, 2005).

#### Problem 2. (50 points)

Dataset: OnlineNewsPopularity.zip (posted on blackboard)

This dataset contains 39,797 articles published by Mashable (<a href="www.mashable.com">www.mashable.com</a>). The features were extracted from the original news articles and are captured by 61 attributes. The goal of the regression task is to predict the number of shares for an article given its attributes.

Please preprocess the data and provide the summary of the data before and after preprocessing. Also provide the summary of the model (R output) and discuss interpretation of the results.

#### Below is the list of attributes.

- 0. url: URL of the article
- 1. timedelta: Days between the article publication and the dataset acquisition
- 2. n tokens title: Number of words in the title
- 3. n tokens content: Number of words in the content
- 4. n unique tokens: Rate of unique words in the content
- 5. n non stop words: Rate of non-stop words in the content
- 6. n\_non\_stop\_unique\_tokens: Rate of unique non-stop words in the content
- 7. num hrefs: Number of links
- 8. num self hrefs: Number of links to other articles published by Mashable
- 9. num imgs: Number of images
- 10. num videos: Number of videos
- 11. average token length: Average length of the words in the content
- 12. num\_keywords: Number of keywords in the metadata
- 13. data\_channel\_is\_lifestyle: Is data channel 'Lifestyle'?
- 14. data\_channel\_is\_entertainment: Is data channel 'Entertainment'?
- 15. data\_channel\_is\_bus: Is data channel 'Business'?
- 16. data\_channel\_is\_socmed: Is data channel 'Social Media'?
- 17. data channel is tech: Is data channel 'Tech'?
- 18. data channel is world: Is data channel 'World'?
- 19. kw\_min\_min: Worst keyword (min. shares)
- 20. kw\_max\_min: Worst keyword (max. shares)
- 21. kw\_avg\_min: Worst keyword (avg. shares)
- 22. kw\_min\_max: Best keyword (min. shares)
- 23. kw max max: Best keyword (max. shares)
- 24. kw avg max: Best keyword (avg. shares)
- 25. kw\_min\_avg: Avg. keyword (min. shares)
- 26. kw\_max\_avg: Avg. keyword (max. shares)
- 27. kw\_avg\_avg: Avg. keyword (avg. shares)
- 28. self\_reference\_min\_shares: Min. shares of referenced articles in Mashable
- 29. self reference max shares: Max. shares of referenced articles in Mashable
- 30. self\_reference\_avg\_sharess: Avg. shares of referenced articles in Mashable
- 31. weekday\_is\_monday: Was the article published on a Monday?
- 32. weekday is tuesday: Was the article published on a Tuesday?
- 33. weekday\_is\_wednesday: Was the article published on a Wednesday?
- 34. weekday\_is\_thursday: Was the article published on a Thursday?
- 35. weekday is friday: Was the article published on a Friday?
- 36. weekday is saturday: Was the article published on a Saturday?
- 37. weekday\_is\_sunday: Was the article published on a Sunday?
- 38. is weekend: Was the article published on the weekend?
- 39. LDA 00: Closeness to LDA topic 0
- 40. LDA 01: Closeness to LDA topic 1
- 41. LDA 02: Closeness to LDA topic 2
- 42. LDA\_03: Closeness to LDA topic 3
- 43. LDA 04: Closeness to LDA topic 4
- 44. global\_subjectivity: Text subjectivity
- 45. global\_sentiment\_polarity: Text sentiment polarity
- 46. global rate positive words: Rate of positive words in the content
- 47. global\_rate\_negative\_words: Rate of negative words in the content
- 48. rate\_positive\_words: Rate of positive words among non-neutral tokens 49. rate negative words: Rate of negative words among non-neutral tokens
- 50. avg positive polarity: Avg. polarity of positive words
- 51. min positive polarity: Min. polarity of positive words
- 52. max\_positive\_polarity: Max. polarity of positive words
- 53. avg\_negative\_polarity: Avg. polarity of negative words

- 54. min\_negative\_polarity: Min. polarity of negative words
  55. max\_negative\_polarity: Max. polarity of negative words
  56. title\_subjectivity: Title subjectivity
  57. title\_sentiment\_polarity: Title polarity
  58. abs\_title\_subjectivity: Absolute subjectivity level
  59. abs\_title\_sentiment\_polarity: Absolute polarity level

- 60. shares: Number of shares (target)