

Financial Analytics

Group work/preentations

Download the file „FA – Group_ data.csv”.

The dataset is about bankruptcy prediction of Polish companies. The data was collected from Emerging Markets Information Service, which is a database containing information on emerging markets around the world. The data comes from the years 2000-2013. The data contains financial information from 1st year of the forecasting period and corresponding class label that indicates bankruptcy status after 5 years.

The variable definitions can be found on the next page.

Question 1:

The Altman z-score is a formula for predicting bankruptcies. It contains of five variables:

- working capital / total assets
- retained earnings / total assets
- EBITDA / total assets
- book value of equity / total liabilities
- sales / total assets

Create a data frame with only these five variables and the bankruptcy outcome.

Clean the data for missing data.

- A) Create a table with the means and standard deviations of all variables.
- B) Produce a scatterplot matrix which includes all of the variables in the data set.
- C) Perform a logistic regression with class as the response variables and the five other variables as the predictor. What do you observe?
- D) Compute the confusion matrix and overall fraction of correct predictions. Explain.
- E) Using the validation set approach, estimate the test error of this model. Split the sample into 50/50 training and test data. Compute the validation set error, which is the fraction of the observations in the validation set that are misclassified. What do you observe?
- F) Repeat part E using KNN with $k=1$. What do you observe?
- G) Repeat part E using KNN with $k=10$. What do you observe?

Question 2:

- A) Try to improve the prediction of the logistic regression by including additional variables. Explain the reasons for your selected variables in detail. How well are you able to predict a bankruptcy?
- B) Extend your analysis to a LASSO approach. First, use two arbitrary lambdas to investigate the behavior of your model. Comment on your findings
- C) Second, tune the optimal lambda parameter. Comment on your finding.

Variable definitions:

- X1 net profit / total assets
- X2 total liabilities / total assets
- X3 working capital / total assets
- X4 current assets / short-term liabilities
- X5 [(cash + short-term securities + receivables - short-term liabilities) / (operating expenses - depreciation)] * 365
- X6 retained earnings / total assets
- X7 EBIT / total assets
- X8 book value of equity / total liabilities
- X9 sales / total assets
- X10 equity / total assets
- X11 (gross profit + extraordinary items + financial expenses) / total assets
- X12 gross profit / short-term liabilities
- X13 (gross profit + depreciation) / sales
- X14 (gross profit + interest) / total assets
- X15 (total liabilities * 365) / (gross profit + depreciation)
- X16 (gross profit + depreciation) / total liabilities
- X17 total assets / total liabilities
- X18 gross profit / total assets
- X19 gross profit / sales
- X20 (inventory * 365) / sales
- X21 sales (n) / sales (n-1)
- X22 profit on operating activities / total assets
- X23 net profit / sales
- X24 gross profit (in 3 years) / total assets
- X25 (equity - share capital) / total assets
- X26 (net profit + depreciation) / total liabilities
- X27 profit on operating activities / financial expenses
- X28 working capital / fixed assets
- X29 logarithm of total assets
- X30 (total liabilities - cash) / sales
- X31 (gross profit + interest) / sales
- X32 (current liabilities * 365) / cost of products sold
- X33 operating expenses / short-term liabilities
- X34 operating expenses / total liabilities
- X35 profit on sales / total assets
- X36 total sales / total assets
- X37 (current assets - inventories) / long-term liabilities
- X38 constant capital / total assets
- X39 profit on sales / sales
- X40 (current assets - inventory - receivables) / short-term liabilities
- X41 total liabilities / ((profit on operating activities + depreciation) * (12/365))
- X42 profit on operating activities / sales
- X43 rotation receivables + inventory turnover in days
- X44 (receivables * 365) / sales
- X45 net profit / inventory
- X46 (current assets - inventory) / short-term liabilities

X47 $(\text{inventory} * 365) / \text{cost of products sold}$
 X48 $\text{EBITDA} / \text{total assets}$
 X49 $\text{EBITDA} / \text{sales}$
 X50 $\text{current assets} / \text{total liabilities}$
 X51 $\text{short-term liabilities} / \text{total assets}$
 X52 $(\text{short-term liabilities} * 365) / \text{cost of products sold}$
 X53 $\text{equity} / \text{fixed assets}$
 X54 $\text{constant capital} / \text{fixed assets}$
 X55 working capital
 X56 $(\text{sales} - \text{cost of products sold}) / \text{sales}$
 X57 $(\text{current assets} - \text{inventory} - \text{short-term liabilities}) / (\text{sales} - \text{gross profit} - \text{depreciation})$
 X58 $\text{total costs} / \text{total sales}$
 X59 $\text{long-term liabilities} / \text{equity}$
 X60 $\text{sales} / \text{inventory}$
 X61 $\text{sales} / \text{receivables}$
 X62 $(\text{short-term liabilities} * 365) / \text{sales}$
 X63 $\text{sales} / \text{short-term liabilities}$
 X64 $\text{sales} / \text{fixed assets}$
 class dummy variable indicating a bankruptcy (=1)

Source:

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