

## Statistical Learning, Midterm 1

Bring calculator. Make sure how to use the tables of the cumulative distribution function of the normal distribution.

- a) Given the inverse of the matrix  $X'X$  and the standard deviation of the error term
  - calculate the standard deviation of the least square estimator of a given coordinate of the beta vector
  - given the value of this estimator - construct a confidence interval for the respective coordinate of beta, perform a z-test for the significance of this coordinate
  - given the true value of beta, calculate the power of the respective z-test.
- b) Consider the situation where  $p < n$  and the elements of  $X$  are iid random variables from  $N(0,1)$ . Find the expected value of the variance of the least squares estimates of individual components of beta.
- c) Given a set of p-values perform the multiple testing procedure using Bonferroni or Benjamini-Hochberg multiple testing procedure.
- d) Find the expected value of the number of false discoveries when individual tests are performed at the significance level alpha.
- e) Given the result of the multiple testing and the indicators of true hypothesis, calculate the False Discovery proportion.
- f) Given RSS and the standard estimation of the error term, use SURE to estimate the prediction error.
- g) Given RSS for different regression models use AIC, BIC, RIC etc to identify the 'best' model.
- h) Given residuals and the elements on the diagonal of the projection matrix  $H$  calculate RSS and the cross-validation estimator of the prediction error.
- i) Assuming the  $X'X=I$  calculate the expected number of false discoveries for any of the considered model selection criteria.
- j) When would you use AIC ? BIC ? RIC ? mBIC ? mBIC2 ?
- k) Given RSS and the eigenvalues of the inverse of  $X'X$  use SURE to estimate the prediction error of ridge regression.
- l) Assuming the  $X'X=I$  and given values of the least squares estimator provide values of ridge and LASSO estimators.
- m) Given  $X'X = I$  calculate MSE of the ridge estimator.
- n) Given  $X'X=I$  calculate the expected value of false discoveries and the power of LASSO

estimator.

- o) Be able to verify the irrepresentability condition for LASSO and understand what it implies.
- p) Given  $RSS$ , the number of variables selected by elastic net (LASSO) [and eigenvalues of the inverse of  $X_A'X_A$ ], estimate the prediction error of elastic net (LASSO).
- q) When would you prefer elastic net over LASSO ? What are the main differences between these methods ?
- r) Why do LASSO and elastic net perform variable selection and ridge regression does not ?