

# Homework 4

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**Due: Monday April 10 at noon**

See general homework tips and submit your files via the course website.

Note that for logistic regression models we can use the **Cbar** measure in SAS as an analogue of Cook's distance to check for pointwise influence, and the Hosmer-Lemeshow test (see the **lackfit** option) to test goodness of fit for a model. Rejection of the Hosmer-Lemeshow test indicates there is a lack of fit (e.g. the model does not fit the data well). The **influence** option in **proc logistic** can be used to obtain influence measures and plots.

**For exercises 1 and 2**, use the **blood pressure** data set as defined in **HW4Data.sas** file from the course space. This data is based on a simulated clinical trial project. The project was developed here at UIUC by Serena Chan and Ruixuan Zhou. Systolic blood pressure measures the severity of a patient's hypertension. There are four treatment groups (coded in variable **RTRTN**, which stands for randomized treatment groups). The main objective here is to investigate whether the new investigational drug, ABC123, is more effective at improving patient's hypertension compared to a reference drug. The variables in **blood** data are:

- **USUBJID**: patient's ID number
- **AGE**
- **SEX**
- **RACE**
- **RTRTN**: 1. Reference 2. ABC123 20mg 3. ABC123 40mg 4. ABC123 80mg
- **SITE**: study's participating sites
- **BASE**: baseline systolic blood pressure
- **VALUE**: systolic blood pressure measured at the visit
- **CHG**: Change from baseline systolic blood pressure

## Exercise 1

- a) Create an indicator variable **remission**. Define **remission**=1 if **value** is  $\leq 120$ , otherwise set **remission**=0. This variable indicates whether a patient responds to the treatment or not. Fit a logistic regression model for **remission** status as a function of all predictors except **value**, **chg**, and **usubjid**. Treat **sex**, **race**, **rtrtn**, **site** as categorical variables. You can use SAS command `"/param=glm descending"` right after the class command. This command re-orders the treatment groups and puts treatment 1 (reference drug) as the reference. Make sure that you model probability of  $\text{resp}=1$ . Comment on the results of the global test and significance of the parameter estimates. Based on Type 3 analysis, what do these results tell us about terms that we may want to retain or remove from the model?
- b) Use stepwise selection to choose the best model. Which predictors did you choose? We'd like to compare the reference drug with the other treatment groups.
- c) Remove any influential points using a cutoff value of 1. If there's no influential points, mention this in your report. Comment on the diagnostic plots (focus on residual plots and influence points). What does Hosmer-Lemeshow's test tell us about goodness of fit of the final model?

- d) Based on your final model, comment on the maximum likelihood estimates (MLE) of baseline and treatments. Why is the MLE for treatment 1 equal to zero? What is the relationship between MLE and odds ratio estimates? Interpret the odds ratio estimates and 95% CI. For example, how does one unit increase in baseline impact the odds ratio? What's the odds ratio comparison between treatment 4 and treatment 1, and what does this mean? What does the 95% CI tell us about the significance of odds ratio estimate? Rank the treatments from the most effective to the least effective.
- e) Use the final model to assess the misclassification errors. What percent of the total number of observations are misclassified?

## Exercise 2

Now consider another binary indicator, **responder**. Define **responder** as a  $\geq 40$  decrease in change of the systolic blood pressure from baseline (i.e., if  $\text{chg} \leq -40$  then  $\text{resp}=1$ ; else  $\text{resp}=0$ ). Fit a logistic regression with this binary variable **responder** as the outcome variable. Repeat all parts as in Exercise 1.