Module 8: Categorical Predictors

Jeffrey Woo

MSDS, University of Virginia

Welcome

- Remind me to record the live session!
- Recommended: put yourself on mute unless you want to speak.
- Reminder: the raise hand button can be found under "Manage Participants".

Agenda

- Practical considerations with categorical predictors
- Q&A
- Small group discussion of guided question set
- Large group discussion of guided question set and other questions that popped up

Practical Considerations with Categorical Predictors

- Terminology
- Categorical predictor with many classes
- Consideration of interaction terms
- Variances not equal across all classes

Terminology

- Regression: Quantitative response, predictors can be quantitative and/or categorical
- Analysis of variance (ANOVA): Quantitative response, categorical predictor(s).
- Analysis of covariance (ANCOVA): Quantitative response, categorical and quantitative predictor(s) (typically no interactions).

I personally view all of these through the regression framework, but some people do distinguish these.

Categorical Predictor with Many Classes

- With many classes, output can be daunting to look at.
- Are you really interested in exploring the differences in the mean response across all the classes?
- Is there a logical way to collapse some classes together that still answers your research question and reduces the number of classes?
- Having more parameters than needed leads to overfitting, which typically leads to poor performance on test data.

See Module 1 notes and R code on how to collapse classes in R.

Consideration of Interaction Terms

- Typically, people start with an additive first order model.
- Interactions considered at the start if:
 - Exploring interactions is part of your research question
 - An interaction makes sense contextually, or is well-established in the literature

Consideration of Interaction Terms

Can use some EDA to explore possibility of interactions (assuming quantitative response in all these scenarios):

- Interaction between a categorical predictor and a quantitative predictor: create scatterplot of response against quantitative predictor, create separate regression lines for each class.
- Interaction between two categorical predictors: side by side boxplots.
- Interaction between two quantitative predictors. If one is discrete, can use scatterplot approach, with separate regression lines for each value of the discrete variable. If both are continuous, you will have to create separate lines for various fixed values of one of the predictors.

Interaction and Correlation

Common question (or some version of this): Aren't variables that interact also correlated?

Short answer: No. For more detailed explanation, take some time to read this: https:

//www.theanalysisfactor.com/interaction-association/

Variances not Equal Across all Classes

Additional assumption: variances are equal across all classes.

- With balanced sample sizes across classes (and not small), the model is fairly robust to this assumption.
- With unbalanced sample sizes, check ratio of largest variance with lowest variance. If not more than 1.5, ok.
- Collapsing classes can help, especially if it makes sense to do so and results in balanced sample sizes.
- Can fit separate regressions for the classes with different variance. Can be more difficult to compare across classes.

Q&A

Breakout Rooms

Pairwise Comparisons

- Bonferroni method is even more conservative than Tukey but easier to work out "by hand".
- I've added an additional pdf under the tutorial for module 8.
 This pdf goes over how to use the Bonferroni method. This pdf should be read after going over the tutorial. You will need this for one of the questions in HW 8.

Upcoming

- HW 8 next Monday as usual.
- Group Evals for Mods 5 to 8 next Monday, via Test & Quizzes.
- New groupings for rest of semester (including project 2). Proj 2 opens next week.
- Module 9: model selection criteria and automated search procedures.