BST 210: Applied Regression Analysis Harvard T.H. Chan School of Public Health

Instructor: Dr. Erin Lake

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Lectures: Fall 2019, Tuesday & Thursday 11:30am – 1:00pm, FXB G12

Lab Sections: L1: Thursday 5:30pm-7pm Kresge G2

L2: Friday 8am-9:30am Kresge 202A L3: Friday 11:30am-1pm FXB G11

Office Hours: Wednesday 11:30am-12:30pm in Building II, Room 436: Erin Lake

Monday 8:30-9:30am in FXB G3: Christina Howe

Monday 12:30-1:30pm in Kresge 204 (except Oct 28 in Kresge 201): Isabella Grabski

Tuesday 1:00-2:00pm in Kresge LL6: Beau Coker

Course Description:

Topics include model interpretation, model building, and model assessment for linear regression with continuous outcomes, logistic regression with binary outcomes, and proportional hazards regression with survival time outcomes. Specific topics include regression diagnostics, confounding and effect modification, goodness of fit, data transformations, splines and additive models, ordinal, multinomial, and conditional logistic regression, generalized linear models, over dispersion, Poisson regression for rate outcomes, hazard functions, and missing data. The course will provide students with the skills necessary to perform regression analyses and to critically interpret statistical issues related to regression applications in the public health literature.

Prerequisites: BIO 201, ID 201, or equivalent (or majoring in BST, CBQG, HDS). (Working knowledge of topics

covered in Bernard Rosner's Fundamentals of Biostatistics, and some programming experience.)

Evaluation: Homework (25%)

Two group projects (25%) Midterm exam (25%) Final exam (25%)

Notes and Textbooks:

Electronic copies of course handouts, notes, homework assignments, datasets, and other materials will be posted on the course website. Course readings are suggested from the following recommended textbooks (available online through Countway Library via the course website):

F.E. Harrell, Regression Modeling Strategies With Applications to Linear Models, Logistic Regression, and Survival Analysis, Springer, Second Edition. (includes example programs in R)

E. Vittinghoff, D.V. Glidden, S.C. Shiboski, and C.E. McCulloch, Regression Methods in Biostatistics: Linear, Logistic, Survival, and Repeated Measures Models, Springer, Second Edition. (includes example programs in Stata)

Readings from additional texts will be added from time to time. (In the course outline below, H denotes Harrell book and V denotes Vittinghoff et al. book.)

Computing:

The course lectures and laboratory sessions will use different software packages (Stata, SAS, R) throughout the course. Many examples will also be posted on the course website. For homework and group projects, students may stick with one package, but may need to switch to another package for certain tasks, as each package has its strengths and limitations. Students can however, generally focus on one statistical package that they wish to develop their skills in.

Competencies:

After successful completion of this course, students will understand and be able to implement regression analyses in public health. In particular, students will be able to:

- Choose the appropriate regression method to answer a public health question.
- Perform analyses of continuous outcomes with linear regression, categorical outcomes with logistic regression and extensions, count outcomes with Poisson regression and extensions, and time to event outcomes with proportional hazards regression.
- Implement strategies to build, select, and assess regression models.
- Summarize and interpret regression models, including assessment of confounding and effect modification and nonlinear associations.
- Develop appropriate tabular and graphical representations of regression findings.
- Interpret and critically evaluate regression methods in the public health and medical literature.

Tentative Course Outline on Next Page:

(subject to change while course is in progress)

| 9/3* | Intro/Review | Week 1: | Predictive multivariable modelling, simple linear | |
|-----------------|--------------------|--|--|--------------------------------|
| 9/5 | Lecture 1 | Course introduction | regression, continuous and categorical predictors, connections with correlation and t-tests (H 1; V 1, | Lab Wk1 |
| 9/10 | Lecture 1 | Week 2: | 3.3) Model formulation and interpretation, assessment of | |
| 9/12 | Lecture 2 | Multiple linear | confounding and effect modification, connections | |
| | | regression | with analysis of variance (H 2.1-2.3; V 4.1-4.6) | Lab Wk2 |
| 9/17 | Lecture 3 | Week 3: | Checking model assumptions of linearity, normality, | <u>HW1</u> |
| 9/19 | Lecture 3 | Assessing model fit | constant variance; outlying, high leverage, and influential points (H 2.7; V 4.7) | Lab Wk3 |
| 9/24 | Lecture 4 | Week 4: Relaxing | Nonlinear terms, data transformations, indicator variables, splines, additive models (H 2.4) | HW2 |
| 9/26 | Lecture 5 | linearity assumptions for continuous predictors | | Lab Wk4 |
| 10/1 | Lecture 6 | Week 5: Multivariable | Bias-variance trade-off, variable selection methods, stepwise procedures, information criteria, | HW3 |
| 10/3 | Lecture 7 | model selection | overfitting, collinearity, data reduction, purposeful selection of covariates, model validation using resampling (H 4, 5, 7; V 10) | Lab Wk5 |
| 10/8 | Lecture 8 | Week 6: | Odds ratios, simple and multiple logistic regression, | HW4- |
| 10/10 | Lecture 9 | Logistic Regression | model formulation and interpretation, assessment of confounding and effect modification (H 10.1-10.3; V 5.1-5.3) | assigned (Group Project) |
| | | | | Lab Wk6 |
| 10/15* | Lecture 10 | Week 7: | Model building, regression diagnostics, goodness of | <u>HW4</u> - |
| 10/17 | Lecture 11 | Assessing Model Fit | fit, model validation (H 10.4-10.11; V 5.4) | due |
| 10/22* | Lecture 12 | Week 8: | Dranartianal adds model for ordinal responses | Lab Wk7 |
| 10/22* 10/24 | Lecture 13 | Extensions of | Proportional odds model for ordinal responses, multinomial model for nominal responses (H 13.1- | HW5 |
| | | Logistic | 13.3) | Lab Wk8 |
| | | Regression | | & review |
| 10/29 | Review | Week 9: | | Midterm |
| 10/31 | Lecture MIDTERM | Review and Midterm exam | | Exam |
| ., . | | | | Lab Wk9 |
| 11/5 | Lecture 14 | Week 10: Conditional | Matched responses, conditional likelihood, conditional logistic regression, modelling the mean | HW6 |
| 11/7 | Lecture 15 | logistic regression and generalized linear models | and variance in generalized linear models, over dispersion, robust variance estimation (V 8.1-8.3) | Lab Wk10 |
| 11/12* | Lecture 16 | Week 11: | Poisson models for counts and rates, negative | HW7 |
| 11/14 | Lecture 17 | Poisson regression and | binomial and zero-inflated Poisson models (V 8.1-8.3) | |
| | | extensions | , | Lab Wk11 |
| 11/19 | Lecture 18 | Week 12: | Censored survival outcomes, survival and hazard | <u>HW8 –</u> |
| | | Introduction to | functions, Kaplan-Meier and Altschuler-Nelson | assigned |

| 11/21 | Lecture 19 | survival analysis | estimators, parametric survival models, log rank tests (H 16.1-16.5, 17.1-17.2; V 3.5, 6.1) | (Group Project) Lab Wk12-13 |
|-------|------------|---|---|--------------------------------------|
| 11/26 | Lecture 20 | Week 13: | Model formulation and interpretation, partial | <u>HW8 –</u> |
| 11/28 | Holiday | Proportional hazards modeling | likelihood, assessment of confounding and effect modification, model building, tied responses (H 19.1-19.3; V 6.1, 6.2) | due |
| | | | | No Lab |
| 12/3 | Lecture 21 | Week 14: | Time-varying covariates, the stratified | HW9 |
| 12/5 | Lecture 22 | More on proportional hazards, sample size and power | proportional hazards model, assessment of the proportional hazards assumption. (H 19.4-19.11; V 6.3-6.6) | Lab Wk14 |
| 12/10 | Lecture 23 | Week 15: | Missing Data and putting the topics together | |
| 12/12 | Lecture 24 | Missing Data | | Lab Wk15 |
| | | | | & review |
| 12/17 | Review | Week 16: | Putting the topics together, and final exam | Final |
| | Lecture 25 | Review and | | Exam |
| 12/19 | FINAL | Final exam | | |

^{10/15*} Indigenous Peoples' Day (school holiday) falls on Monday of this week.

^{10/22*} End of Fall Term 1 (F1) falls on Friday 10/25 of this week.

^{11/12*} Veteran's Day (school holiday) falls on Monday of this week.