Lecture 1

Introduction

STAT 8020 Statistical Methods II August 20, 2020



Who is the instructor?

Class Policies Schedule

Tell us about yourself

imple Linear egression

analysis

Simple Linear Regression

Whitney Huang Clemson University



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Simple Linear Regression

Who is the instructor?

Who am I?

- Second year Assistant Professor of Applied Statistics and Data Science
- Born in Laramie, Wyoming, grew up in Taiwan





 With a B.S. in Mechanical Engineering, switched to Statistics in graduate school

Got a Ph.D. (Statistics) in 2017 at Purdue University.





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How to reach me?

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Email: wkhuang@clemson.edu

Office: O-221 Martin Hall

• Office Hours: TR 11:00am – 12:00pm and by

appointment



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Logistics

- We will meet TR 12:30pm 1:45pm via Zoom
- There will be three online exams and a (comprehensive) online final. The (tentative) dates for the three exams are:
 - Exam I: Sept. 24, Thursday
 - Exam II: Oct. 20, Tuesday
 - Exam II: Nov. 12, Tuesday
 - The Final Exam will be given on Wednesday, Dec. 7, 3:00 pm -5:30 pm.
- No classes on Nov. 3 (Fall Break) & 26 (Thanksgiving)



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Class Website

CANVAS and my teaching website (link:

https://whitneyhuang83.github.io/STAT8020/Fall2020/stat8020_2020Fall.html)

- Course syllabus [Link] / Announcements
- Lecture slides/notes
- Homework assignments
- Exam and homework schedule
- Data sets for lectures and homework
- R code



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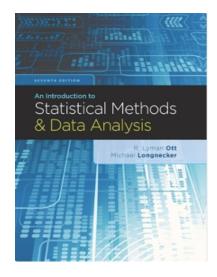
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Recommended Textbook

An Introduction to Statistical Methods and Data Analysis, 6th Edition. Lyman Ott and Micheal T. Longnecker, Duxbury, 2010; ISBN-13: 978-1305269477





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Evaluation

• Grade Distribution:

Exam I:	25%
Exam II	25%
Exam III	25%
Final Exam	25%

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Letter Grade:

/ /- 30.00	_ ^
$88.00 \sim 89.99$	A-
$85.00 \sim 87.99$	B+
$80.00 \sim 84.99$	В
$78.00 \sim 79.99$	B-
$75.00 \sim 77.99$	C+
$70.00 \sim 74.99$	С
$68.00 \sim 69.99$	C-
<= 67.99	F

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Tentative Topics and Dates

Part I: Regression Analysis (August 20 – September 24)

- Review of Simple Linear Regression
- Multiple Linear Regression: Statistical Inference; Model Selection and Diagnostics
- Regression Models with Quantitative and Qualitative Predictors
- Nonlinear and Non-parametric Regression

Part II: Categorical Data Analysis (September 29 – October 20)

- Review of Inference for Proportions and Contingency Tables
- Relative Risk and Odds Ratio
- Logistic Regression and Poisson Regression



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Tentative Topics and Dates cont'd

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Part III: Experimental Design (October 22 – November 12)

- Introduction to Experimental Design: Principles and Techniques
- Completely randomized Designs, Block Designs, Latin Square Designs, Nested and Split-Plot Designs
- Computer experiments

Part IV: Multivariate, Spatial and Time Series Analysis (November 17 – December 3)

- Discriminate Analysis, Principle Components Analysis, and Cluster Analysis
- Basic of time series and spatial data analysis

Computing

We will use software to perform statistical analyses. The recommended software for this course are ${\tt JASP}$ and

- R/Rstudio
 JASP
 - a free/open-source graphical program for statistical analysis
 - available at https://jasp-stats.org/
 - R Studio
 - a free/open-source programming language for statistical analysis
 - available at https://www.r-project.org/(R); https://rstudio.com/(Rstudio)

You are welcome to use a different package (e.g. SAS, JMP, SPSS, Minitab) if you prefer



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- Your name
- Degree program
- Your background in Statistics/Computing



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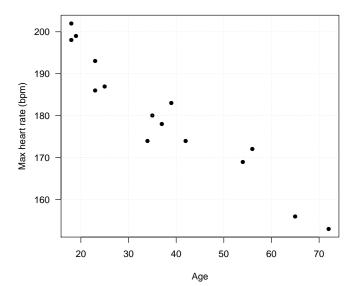
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Simple Linear Regression

Review of Simple Linear Regression

What is Regression Analysis?

Regression analysis: A set of statistical procedures for estimating the relationship between response variable and predictor variable(s)





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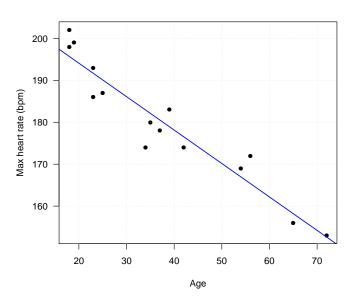
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Scatterplot: Is Linear Trend Reasonable?





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Simple Linear Regression (SLR)

Y: dependent (response) variable; *X*: independent (predictor) variable

 In SLR we assume there is a linear relationship between X and Y:

$$Y_i = \beta_0 + \beta_1 X_i + \varepsilon_i$$

- We will need to estimate β_0 (intercept) and β_1 (slope)
- Then we can use the estimated regression equation to
 - make predictions
 - study the relationship between response and predictor
 - control the response
- Yet we need to quantify our uncertainty regarding the linear relationship



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Regression equation: $Y_i = \beta_0 + \beta_1 X_i + \varepsilon_i$



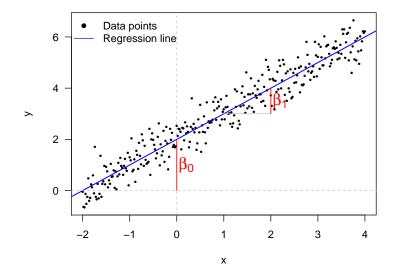


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Assumptions about ε

In order to estimate β_0 and β_1 , we make the following assumptions about ε

- $\bullet \ \mathrm{E}[\varepsilon_i] = 0$
- $Var[\varepsilon_i] = \sigma^2$
- $Cov[\varepsilon_i, \varepsilon_j] = 0, \quad i \neq j$

Therefore, we have

The regression line $\beta_0 + \beta_1 x$ represents the **conditional expectation curve** whereas σ^2 measures the magnitude of the **variation** around the regression curve



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Estimation: Method of Least Square

For the given observations $(x_i, y_i)_{i=1}^n$, choose β_0 and β_1 to minimize the *sum of squared errors*:

$$L(\beta_0, \beta_1) = \sum_{i=1}^{n} (y_i - \beta_0 - \beta_1 x_i)^2$$

Solving the above minimization problem requires some knowledge from Calculus....

$$\hat{\beta}_1 = \frac{\sum_{i=1}^n (X_i - \bar{X})(Y_i - \bar{Y})}{(X_i - \bar{X})^2}$$

$$\hat{\beta}_0 = \bar{Y} - \hat{\beta}_1 \bar{X}$$

We also need to **estimate** σ^2

$$oldsymbol{\hat{\sigma}}^2=rac{\sum_{i=1}^n(Y_i-\hat{Y}_i)^2}{n-2},$$
 where $\hat{Y}_i=\hat{eta}_0+\hat{eta}_1X_i$



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Properties of Least Squares Estimates

- **CLEMS**
- Gauss-Markov theorem states that in a linear regression these least squares estimators
 - Are unbiased, i.e.,
 - $E[\hat{\beta}_1] = \beta_1; E[\hat{\beta}_0] = \beta_0$
 - $\bullet \ \mathrm{E}[\hat{\sigma}^2] = \sigma^2$
 - Have minimum variance among all unbiased linear estimators

Note that we do not make any distributional assumption on ε_i

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Example: Maximum Heart Rate vs. Age



The maximum heart rate MaxHeartRate of a person is often said to be related to age Age by the equation:

MaxHeartRate = 220 - Age.

Suppose we have 15 people of varying ages are tested for their maximum heart rate (bpm) (link to the "dataset":

http://whitneyhuang83.github.io/STAT8010/Data/
maxHeartRate.csv)

- Compute the estimates for the regression coefficients
- Compute the fitted values
- **(a)** Compute the estimate for σ

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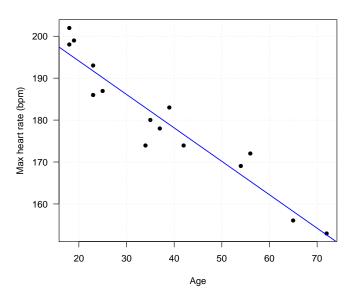
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Linear Regression Fit



Question: Is linear relationship between max heart rate and age reasonable? ⇒ Residual Analysis



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Residuals



 The residuals are the differences between the observed and fitted values:

$$e_i = Y_i - \hat{Y}_i,$$

where
$$\hat{Y}_i = \hat{eta}_0 + \hat{eta}_1 X_i$$

- e_i is NOT the error term $\varepsilon_i = Y_i \mathrm{E}[Y_i]$
- Residuals are very useful in assessing the appropriateness of the assumptions on ε_i . Recall
 - $E[\varepsilon_i] = 0$
 - $\operatorname{Var}[\varepsilon_i] = \sigma^2$
 - $Cov[\varepsilon_i, \varepsilon_j] = 0, \quad i \neq j$

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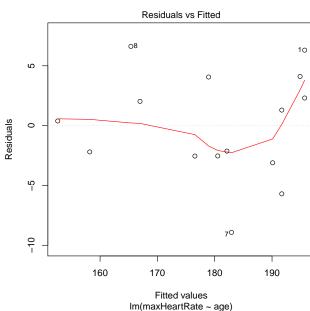
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Residual Analysis





Simple Linear



Residual Analysis



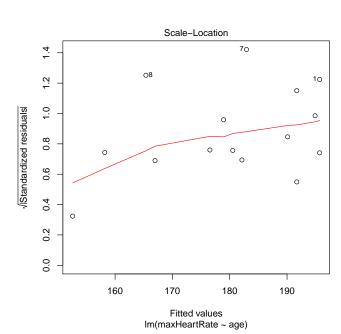


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Summary

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In this lecture, we reviewed

- Simple Linear Regression: $Y_i = \beta_0 + \beta_1 X_i + \varepsilon_i$
- Method of Least Square for parameter estimation
- Residual analysis to check model assumptions
 Next time we will talk about
 - More on residual analysis
 - Normal Error Regression Model and statistical inference for β_0 , β_1 , and σ^2
 - Prediction

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