

STAT406- Methods of Statistical Learning Lecture 1

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UBC - Sep / Dec 2019

About me

- Matias Salibian-Barrera
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- `http://github.com/msalibian`
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Prerequisites

- STAT306 or CPSC340
- You are comfortable **working independently**
- You are **motivated** and enjoy being challenged
- You **want to be here** and are **interested in learning** the material

Philosophy of the class

- We're here to **help you learn** (vs. teaching you)
- We'll encourage **engagement**, **curiosity** and **generosity**
- We'll have **zero tolerance for plagiarism**
- We favour **steady work** through the Term (vs. sleeping until finals)

Lectures



- **Bring your laptop**
- **Prepare for class**
- Ask, doubt, question, discuss

Lectures / Labs / Office hours

- Two weekly lectures, one weekly lab
- You are expected to **show up**
- **Pre**-lecture readings and activities
- **Office hour**: TBA, check Canvas next week
- It is a **4th year course** – expectations are high

Grades

- Practice Webwork: 0%
- Lab activities: 0%
- Four in-class midterms: 50%
- Final exam: 50%.
- There will be **no make-up** activities, quizzes, labs, or exams. Anything you **miss** will be assigned to your **final exam weight**.

Textbook?

- Reference books – on-line, free
 - **[JWHT13]** - *An Introduction to Statistical Learning*, James, Witten, Hastie, Tibshirani, R., 2013, Springer, New York.;
 - **[HTF09]**: Hastie, T., Tibshirani, R. and Friedman, J. *The Elements of Statistical Learning*. 2009. Second Edition. Springer-Verlag New York.
- Lecture slides + GitHub notes + Jupyter notebooks

Computer



- We will use R
 - Open source and free
 - “Standard” in Statistics

Computer

- **YOU ARE RESPONSIBLE** for learning
- We **CAN HELP** with \mathbb{R}
- We **WON'T teach all of** \mathbb{R}
- There are tons of on-line resources

Code

Why think when you can CTRL-C + CTRL-V?



Just copy
Matias' code?

It never ends well

O RLY?

Former student

Other resources

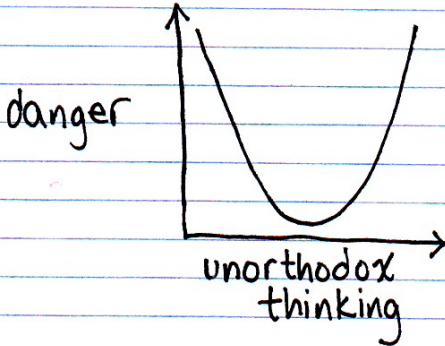
- Canvas: Webwork solutions, Labs solutions, grades
- GitHub: Slides, notes, notebooks
- PIAZZA: Discussions, announcements

`plazza.com/ubc.ca/winterterm12019/stat406`

More about scripts

- You can read them from `GitHub`
- You can cut-and-paste block-by-block
- You can run / play with **notebooks**:
 - On your computer
 - On `https://ubc.syzygy.ca/`

Lectures?



thisisindexed.com

Discussion

Statistical learning

Discussion

Models versus “predictive algorithms”

Review...

- Y is the response variable
- \mathbf{X} is a vector of auxiliary variables

$$Y = f(\mathbf{X}) + \varepsilon$$

- $f : \mathbb{R}^p \rightarrow \mathbb{R}$, unknown
- If $E[\varepsilon] = 0$

$$E[Y | \mathbf{X}] = f(\mathbf{X})$$

Review...

- In a linear model, f is a linear function

$$Y = \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \cdots + \beta_p X_p + \varepsilon$$

- If $E[\varepsilon] = 0$

$$E[Y|X_1, X_2, \dots, X_p] = \\ \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \cdots + \beta_p X_p$$

Review...

- Why would we want to estimate the coefficients of the linear model?
- What's the connection with prediction?

Review...

- Why would we want to estimate the coefficients of the linear model?
- What's the connection with prediction?
- “Best predictor”

$$\arg \min_{\mathbf{h}} E \left[(Y - \mathbf{h}(\mathbf{X}))^2 \right] = E[Y | \mathbf{X}]$$

Review...

- Best predictor is the regression function
- We need to estimate $E[Y|\mathbf{X}]$
- We propose a model (e.g. linear) for $E[Y|\mathbf{X}]$ and estimate it (e.g. estimate its parameters)
 - For example in a linear model, to estimate $f(\mathbf{X})$ we need to estimate $\beta_0, \beta_1, \dots, \beta_p$

Review...

- Data $(Y_1, \mathbf{X}_1), (Y_2, \mathbf{X}_2), \dots, (Y_n, \mathbf{X}_n),$
- Least squares estimator

$$\hat{\beta} = \arg \min_{\beta_0, \beta} \sum_{i=1}^n (Y_i - \beta_0 - \beta' \mathbf{X}_i)^2$$

Review...

- There is a closed form for $\hat{\beta}$

$$\hat{\beta} = (X'X)^{-1}X'\mathbf{Y}$$

where $\mathbf{Y} = (Y_1, Y_2, \dots, Y_n)'$ and

$$X = \begin{pmatrix} 1 & \cdots & \mathbf{X}_1 & \cdots \\ 1 & \cdots & \mathbf{X}_2 & \cdots \\ 1 & \cdots & \mathbf{X}_3 & \cdots \\ \vdots & \cdots & \cdots & \cdots \\ 1 & \cdots & \mathbf{X}_n & \cdots \end{pmatrix}$$

Review...

- As long as $E[\varepsilon] = E[\varepsilon|\mathbf{X}] = 0$ we have

$$E[\hat{\beta}] = \beta = \begin{pmatrix} \beta_0 \\ \beta_1 \\ \vdots \\ \beta_p \end{pmatrix}$$

- The LS estimator is consistent and unbiased
- Do we need any other assumption?

Review...

- Consider the air pollution data
- $n = 60$ observations
- $p = 16$, response variable: MORT
- A linear model:

$$\text{MORT} = \beta_0 + \beta_1 \text{PREC} + \beta_2 \text{JANT} + \dots + \epsilon$$

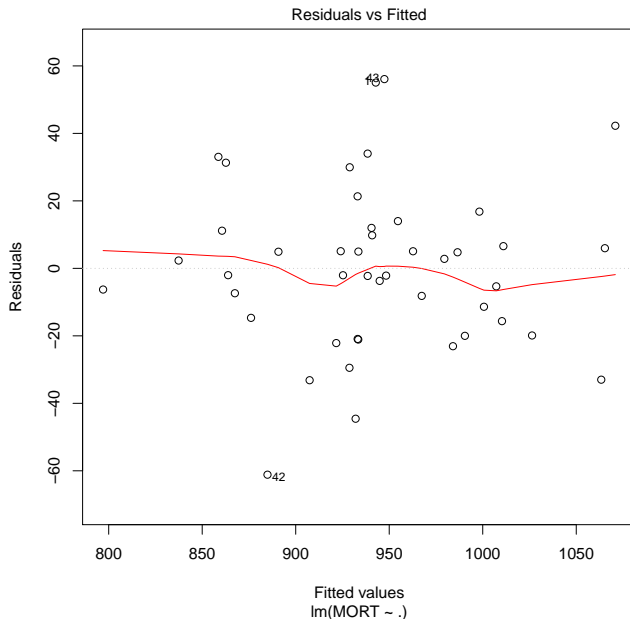
or equivalently

$$\begin{aligned} E \left(\text{MORT} \mid \text{PREC}, \text{JANT}, \dots \right) \\ = \beta_0 + \beta_1 \text{PREC} + \beta_2 \text{JANT} + \dots \end{aligned}$$

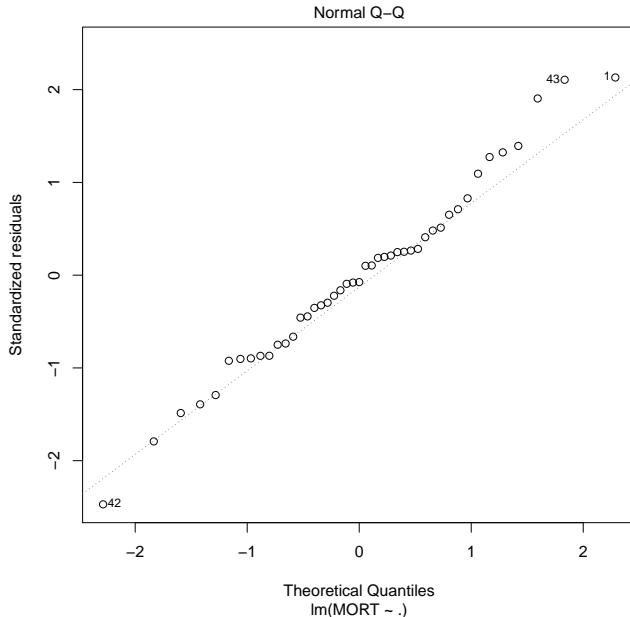
Review...

- Randomly split into a training ($n=45$) and a test set ($n=15$)
- Use training set to fit a model
- Read data into object `x.tr`
- Fit the “full” model
- “Look” at the fit

Diagnostics



Diagnostics



Diagnostics

```
> full <- lm(MORT ~ ., data=x.tr)
> summary(full)

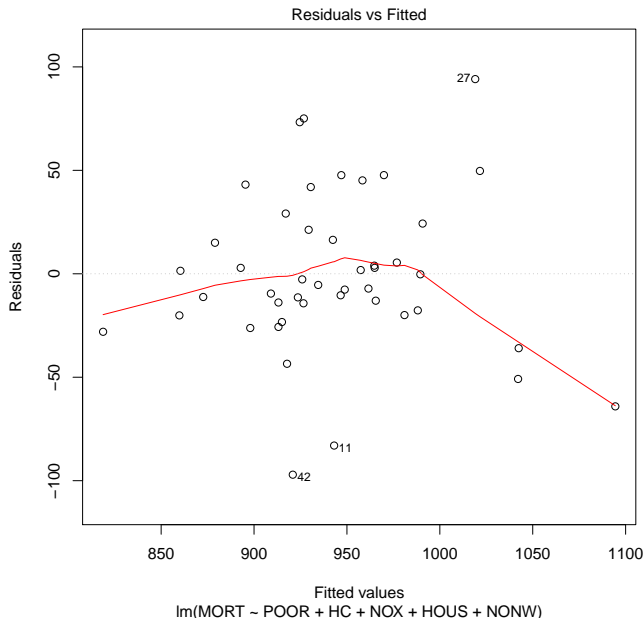
> sum( resid(full)^2 )
[1] 25898.8
```

Fit a reduced model

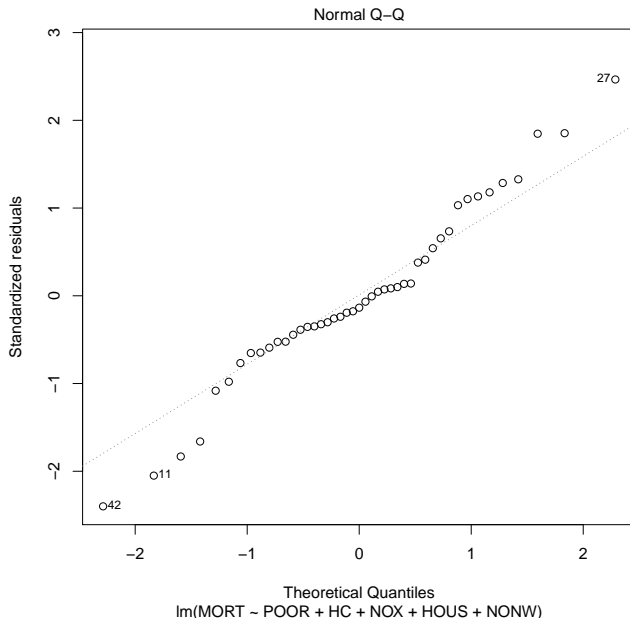
```
> reduced <- lm(MORT ~ POOR + HC +  
NOX + HOUS + NONW, data=x.tr)
```

```
> sum( resid(reduced)^2 )  
[1] 66135.29
```

Diagnostics for reduced model



Diagnostics for reduced model



Discussion

Goodness of fit versus
prediction power

Predictions

- Read the test set
- Use both models to predict `MORT`
- Compare both sets of predictions

Predictions

```
> x.te <- read.table('pollution-test.dat', ...  
>  
> x.te$pr.full <- predict(full, newdata=x.te)  
> x.te$pr.reduced <- predict(reduced,  
                             newdata=x.te)  
>  
> with(x.te, mean( (MORT - pr.full)^2 ))  
[1] 4677.45  
>  
> with(x.te, mean( (MORT - pr.reduced)^2 ))  
[1] 1401.571
```

Discuss

Ready, set, go!

- Check `canvas.ubc.ca` often
- Visit `github.com/msalibian/STAT406` often
- Use PIAZZA
- **Do the pre-class readings**
- **Attend the labs**
- **Show up**