

WED NOV 29

Quantifying uncertainty

Final due Fri next week (Available by this Fri 11:59 PM)

MODEL: Suppose have categorical variable (neighborhood)

DATA housing costs model as function of size  
neighborhood

$$y_i = \beta_0 + \beta_1 x_{i,1} + \dots + \beta_k x_{i,k} + \varepsilon_i$$

CATEGORICAL VARIABLE

$r$  categories ( $r$  neighborhoods)

For each category (neighborhood)  $j = 1, \dots, r$

$$S_{i,j} = \begin{cases} 1 & \text{if } i^{\text{th}} \text{ unit is in neighborhood } j \\ 0 & \text{o/w} \end{cases}$$

neighborhoods river, bethel, churchill, campus, whitaker  
house bethel  
river bethel churchill campus whitaker  
0 1 0 0 0

$$y_i = \beta_{\text{river}} \underline{S_{i,\text{river}}} + \beta_{\text{BETHEL}} \underline{S_{i,\text{BETHEL}}} + \dots + \beta_{\text{WHITAK}} \underline{S_{i,\text{WHITAK}}} \\ + \underline{\beta_{\text{area}}} \text{area}_i + \beta_{\text{year}} \text{year}_i + \varepsilon_i$$

MODEL: parameters are  $\beta_{\text{river}}$   $\beta_{\text{BETHEL}}$   $\dots$   $\beta_{\text{area}}$   $\beta_{\text{year}}$   
estimate unknown parameters  $\beta_{\text{river}}$   $\dots$  via  
least-squares

$$E y_i = \beta_{river} \delta_{i,river} + \beta_{BOTHED} \delta_{i,BOTHED} + \dots + \beta_{water} \delta_{i,water} + \beta_{area} area_i + \beta_{year} year_i$$

If the data point belongs to river road neighborhood what is expected rent?

$$E y_i = \beta_{river} + \beta_{area} area_i + \beta_{year} year_i$$

Center the numerical values at their averages

$$area \rightarrow area - \overline{area} \quad year \rightarrow year - \overline{year}$$

$$area' = 0 \Leftrightarrow area = \overline{area}$$

Then coefficient

$$\beta_{river} = E(\text{rent in river road})$$

when area average  
year is average

$\beta_{area}$  interpretation? rate per year of observed increase, holding everything else constant.

Estimate all these coefficients using LS.

$\hat{\beta}_{area}, \hat{\beta}_{year}, \hat{\beta}_{RIVER}$  etc

TRUE VALUES, ESTIMATES

$$\hat{\beta} \pm 2 \times SE$$

$\hookrightarrow S.E. = ?$  ESTIMATE OF THE S.D. OF  $\hat{\beta}$

$\beta$  is in the interval  $\hat{\beta} \pm 2SE$  about 95% of the time

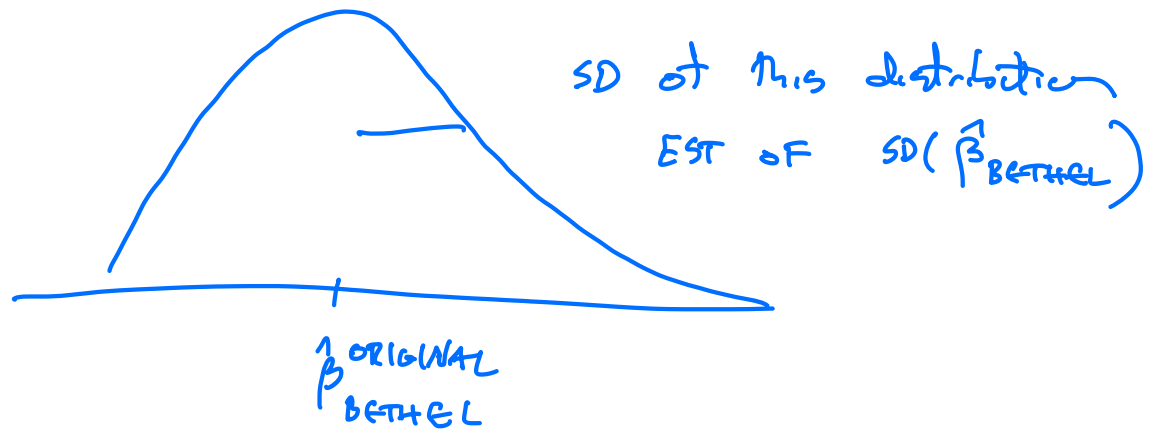
MATHEMATICAL FORMULAS FOR SE'S

ESTIMATE SE. OF  $\hat{\beta}$  VIA SIMULATION  
Algorithm for determining S.E. of  $\hat{\beta}$ :

MODEL FOR DATA: see above

PARAMETRIC BOOTSTRAP: USE MODEL ABOVE  
PUT IN ESTIMATED PARAMETER VALUES  
(FROM ORIGINAL DATA!)

SIMULATE FROM MODEL (HAVE EVERYTHING NEEDED)  
FOR EACH SIM: GET AN EST OF  $\hat{\beta}_{\text{BETHEL}}$   
DIST'N OF  $\hat{\beta}_{\text{BETHEL}}$



---

BOOTSTRAP

LIKE NEW DATASET DON'T TRUST MODEL  
WE SPECIFIED

TAKE NEW DATA POINTS BY DRAWING  
FROM EXISTING DATASET (w REPLACEMENT)

---

SUMMARIZE! CALCULATE COEF ESTIMATES USING LS

UNSATISFACTORY!  $\hat{\beta}$  ANY ESTIMATE w/o A CERTAINTY  
QUANTIFICATION IS USELESS

USE CI TO GIVE UNCERTAINTY QUANTIFICATION  
 $SE(\hat{\beta}) = \text{EST. SD OF } \hat{\beta} \text{ TO FORM A CI}$

SIMULATION IS UNIVERSAL METHOD

PARAMETRIC  $\leftarrow$  PUT IN ESTIMATED PARAMETERS  
IN MODEL, SIMULATE

NON-PARAMETRIC  $\leftarrow$  RESAMPLE THE SAMPLE  
USE SIMULATED DIST'N OF  $\hat{\beta}$  TO GET  
95% CI (EMPIRICAL QUANTILES)