

t-Tests for Coefficients

- Hypotheses:
 - $H_0: \beta_i = 0$
 - $H_a: \beta_i \neq 0$
- Test Statistic:
 - $t^* = \hat{\beta}_i / SE_{\hat{\beta}_i}$
- P-Value: Non-directional and Use t-Distribution with $n-k-1$ d.f.

Confidence Intervals for Coefficients

- Formula for 95% Confidence Interval:

$$\hat{\beta}_1 \pm t_{0.025, n-2} * SE_{\hat{\beta}_1}$$

- Critical Value $t_{0.025, n-k-1}$ is the 97.5 percentile on the t-Distribution with $n - k - 1$ Degrees of Freedom

ANOVA Table

- Updated for Multiple Linear Regression

Source	d.f.	Sum of Squares	Mean Square	F	P-value
Model	k	SS_{Model}	$\frac{SS_{Model}}{k}$	$\frac{MS_{Model}}{MSE}$	$F_{k,n-k-1}$
Residual	$n - k - 1$	SSE	$\frac{SSE}{n - k - 1}$		
Total	$n - 1$	SS_{Total}			

- Formulas for SS_{Model} , SSE , and SS_{Total} are Same

ANOVA F-Test

- Tests the **Overall** Effectiveness of the Linear Model as a Whole
- Hypotheses:
 - $H_0: \beta_1 = \beta_2 = \dots = \beta_k = 0$
 - $H_a: \text{at least one } \beta_i \neq 0$
- Test Statistic: *Make sure you divide by the correct degrees of freedom.*
- P-value: Use F-Distribution with k numerator degrees of freedom and $n-k-1$ denominator degrees of freedom.

Coefficient of Determination

- Recall Formula:

$$R^2 = \frac{SS_{Model}}{SS_{Total}} = 1 - \frac{SSE}{SS_{Total}}$$

- Book Uses R^2 instead of r^2 Since Finding R-squared is Not as Simple as Just Calculating Correlation and Squaring It
- R^2 can be Found by Squaring the Correlation between y and \hat{y}
- Problem: *Adding a new predictor variable into your linear regression model **will never** decrease R^2 (make it worse)*

Adjusted Coefficient of Determination

- Formula for Adjusted R-Squared:

$$R_{adj}^2 = 1 - \frac{\left(\frac{SSE}{n - k - 1}\right)}{\left(\frac{SSTotal}{n - 1}\right)} = 1 - \frac{\hat{\sigma}_\epsilon}{s_y^2}$$

- SSE will **Never Increase** as You Add Variables to Your Model
- Sample Variance of Y Is **Completely Unaffected** by Model
- Complexity Measured By k **Influences** adjusted R-squared

Adjusted Coefficient of Determination

- Adding an Extra Variable to the Model Will Likely Cause SSE to Decrease or Stay the Same (Extremely Unusual)
- However, MSE may Actually Increase Since the **Error Degrees of Freedom** in the Denominator **May Decrease More**

$$MSE = \left(\frac{SSE}{n - k - 1} \right)$$

Confidence and Prediction Intervals

- Confidence and Prediction Intervals are Still More Valuable Than Point Predictions
- More Difficult to Calculate by Hand
 - Reason 1: Uncertainty in Each Slope
 - Reason 2: Model is Not Just a Straight Line on a Cartesian Plane

Supplement for Lecture 14

- Fit Multiple Linear Regression Model to Data
- Interpreting Individual Slopes and t-Tests
- Standard Error of Regression and adjusted R-squared
- ANOVA table and F-Test
- Confidence Intervals and Prediction Intervals

Make Reasonable Decisions

