

PUB – POS 316 Week 14a

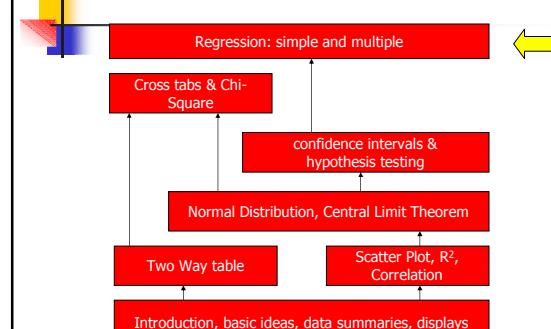
Simple linear regression

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Course Road Map



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Agenda

- Introduction
 - Association
 - Scatter plots
- The linear regression model
- Tests for significance and CI
- ANOVA
- F-test

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Introduction

- Review from last class
- Association between variables:

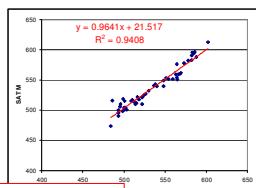
Two variables are associated if knowing the value of one of them tells you something about the other one.
- Examples:
 - *Effort and grade*
 - *Positive association*
 - *Price and demand*
 - *Negative association*

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Least Square Regression



Population y-intercept
Population slope
Random error
Dependent variable
Independent variable

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Least Square Regression

- What if we do not have the complete information about our population?

The equation for the sample regression line is $y = b_0 + b_1 x + \varepsilon$. The components are labeled as follows:

- sample y-intercept
- sample slope
- Independent variable
- Dependent variable
- Random error in sample

What does estimation of slope and intercept mean? (b estimation of β)

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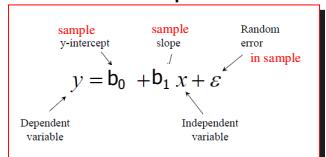
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Tests for significance and CI

- So, if we are estimating the slope and the intercept of the line,...
- WE CAN BE WRONG
- We need to report confidence intervals!
- Confidence interval for the slope and the intercept

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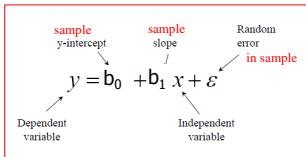
Tests for significance and CI

Remember:

- Margin of error = $z \cdot (\text{proper standard deviation})$
- And if you do not have the st dev in population, you use t .
- The same here: (And the good thing is that excel gives you the proper standard deviation (standard error))
- Margin of error = $t^*_{0.025} \cdot (\text{SE})$ $(df=n-2)$

excel

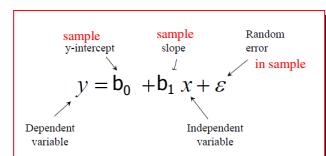
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Tests for significance and CI

- What will happen for the slope and intercept if we conduct the study many times?
- The important question: Are you confident enough that the slope is not zero? ($\beta_1 \neq 0$)

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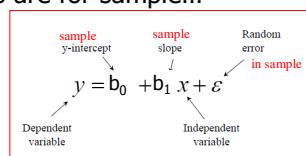


Tests for significance and CI

- Hypotheses: $H_0: \beta_1 = 0$
- $H_a: \beta_1 \neq 0$
- Don't forget: β 's are related to the population – b 's are for sample...

- Very simple:
- $t = b_1 / SE_{b_1}$

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Tests for significance and CI

- So, 1. we should report confidence intervals for β 's., or 2. We should test hypothesis that β 's are different from zero.
- Back to excel.
- For your own work learning one of these two methods is enough.

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Analysis of Variance (ANOVA)

ANOVA:

Analysis of Variance

- As you have seen in this class, we are very interested to learned about variance (or standard deviation) in a data set. Remember?
- How can we explain why there is a variation in a data set?

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Analysis of Variance (ANOVA)

Example:

- Why some students perform better?
- Why some countries have a better health status?
- What can explain variation in the divorce rate?
- Isn't that the whole purpose of social science?!!

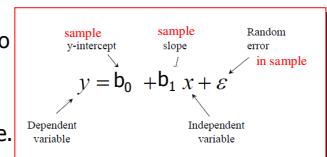
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Analysis of Variance (ANOVA)

A regression analysis helps us to understand the reasons of the variance in our dependent variable.



- If you can show that $\beta_1 \neq 0$ (i.e., reject the null hypothesis), you are saying that some portion of variance in your dependent variable (y) is explained by your independent variable (x).

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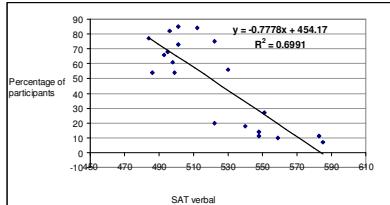
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F-Test

In general:

- DATA = FIT + RESIDUAL



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F-Test

In general:

- DATA = FIT + RESIDUAL

$$y_i = \hat{y}_i + (y_i - \hat{y}_i)$$

$$(y_i - \bar{y}) = (\hat{y}_i - \bar{y}) + (y_i - \hat{y}_i)$$

$$\sum (y_i - \bar{y})^2 = \sum (\hat{y}_i - \bar{y})^2 + \sum (y_i - \hat{y}_i)^2 \quad \text{Sum of Squares}$$

$$\text{SST} = \text{SSM} + \text{SSE}$$

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F-Test

- DATA = FIT + RESIDUAL

$$\text{SST} = \text{SSM} + \text{SSE}$$

$$R^2 = \text{SSM} / \text{SST}$$

$$\text{MSE (Mean Square Error)} = \text{SSE} / (n-2)$$

$$F = \frac{\text{SSM} / df_m}{\text{SSE} / df_e}$$

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Analysis of Variance (ANOVA)

What you need to remember:

- F shows if your regression shows anything at all. (or it is just a random pattern between your x and y).
- Excel reports F, compares it with F-table, reports p-value. **Just we should be able to read it and know what it is about.**

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Analysis of Variance (ANOVA)

- Back to excel. Read F-test.

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Summary

- What we need to know:
 - 1. When to conduct a regression.
 - 2. To use excel to conduct regression.
 - 3. To interpret the results.
 - 4. To know how to get t-value and test significance of coefficients and confidence intervals (if t or p or both are not given)

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Example

- Example:
- We have data from a sample of computer science students. We would like to test to see if there is any association between their high school math grades and their SAT math.
- What should we do? How?

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Example

SUMMARY OUTPUT						
Regression Statistics						
Multiple R	0.382981264					
R Square	0.146674648					
Adjusted R Square	0.12851879					
Standard Error	92.39064342					
Observations	49					
ANOVA						
	df	SS	MS	F	Significance F	
Regression	1	68959.52299	68959.52299	8.078640185	0.006606171	
Residual	47	401193.4566	8536.030992			
Total	48	470152.9796				
	Coefficients	Standard Error	t Stat	P-value	Lower 95%	Upper 95%
Intercept	403.2044621	67.38424363	5.983660873	2.84931E-07	267.6448515	538.7640727
X Variable 1	22.72341076	7.99474077	2.84229488	0.006606171	6.640067123	38.80675439

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Check if the slope is significantly different from zero.
That's the most important thing

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- That's almost every thing that we need to know about regression!..

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