

## ECON 640 - PROBLEM SET 2

**Instructions:** Please submit all answers as a physical copy in a separate document. For Stata output, ensure that your **do-files and results** are printed without any error messages. In essence, I should be able to clearly understand what you did (Please do not handwrite your code!). Full credit will only be awarded to answers that demonstrate clear reasoning and a solid understanding of the problem. This problem set is due at the **beginning of class on October 9th**.

1. For a linear regression model:

$$y_i = \beta_0 + \beta_1 x_i + u_i$$

- (a) Derive the OLS estimators for  $\beta_0$  and  $\beta_1$ .
- (b) What assumption(s) is(are) necessary to prove that the OLS estimator  $\hat{\beta}_1^{OLS}$  is unbiased?
- (c) Derive  $\hat{\beta}_1^{OLS}$  again two alternative methods:
  - 1. Using the projection matrix approach.
  - 2. Using the method of moments approach.
- (d) Derive the variance of  $\hat{\beta}_1^{OLS}$
- (e) What assumption(s) is(are) necessary to prove that the OLS estimator  $\hat{\beta}_1^{OLS}$  is consistent?
- (f) What assumption(s) is(are) necessary to prove that the OLS estimator  $\hat{\beta}_1^{OLS}$  is BLUE (best linear unbiased estimator)?
- (g) Having derived the expression of the variance of  $\hat{\beta}_1^{OLS}$ , how can you estimate it using residual? Propose an estimator for  $Var(\hat{\beta}_1^{OLS} | X)$
- (h) Suppose someone proposed the following simplified model:

$$y_i = \beta x_i + u_i$$

Does this model require more or fewer assumptions?

- (i) Derive a least squares estimator for  $\hat{\beta}$
- (j) Is this estimator  $\hat{\beta}$  unbiased? What assumptions do you need?

2. Empirical Task: Linear Regression. Use the following dataset:

use `http://fmwww.bc.edu/ec-p/data/wooldridge/wage1`, `clear`

- (a) run a naive OLS regression with outcome = wage; and independent variable = education. Interpret the coefficient's magnitude and significance level. Then, explain the information provided in Stata regarding standard error and F-statistic.
- (b) Next, calculate the natural logarithm of wage and re-estimate the regression using `log(wage)` as the dependent variable. Interpret the results and compare them to the previous model. If the interpretations differ substantially, what concerns might arise?
- (c) Next, expand your control variable set by sequentially including female, experience, tenure, non-white, and married. This will result in five additional models alongside the main model. How does the coefficient on education change in each model? Interpret the results. Use `esttab` command to present all models in a **single** table (so you can compare coefficients across models), reporting standard errors with significance levels of 0.1, 0.05, and 0.01. Based on the table, write a paragraph discussing the type of bias each control variable reduces and whether the results make sense.
- (d) Finally, re-estimate all models using robust standard errors (hint: `reg y x, robust`), create a new table, and compare the standard errors to those in the previous table. Identify which set of standard errors is larger and explain the potential reasons for the difference.