



Workshop2. Functional Form

UNAM – FE Econometrics I

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Student Learning Outcomes (SLOS)

☐ **a.** Recognize assumptions associated with linear regression

☐ **b.** Describe properties of estimators

☐ **c.** Describe the concept of functional form

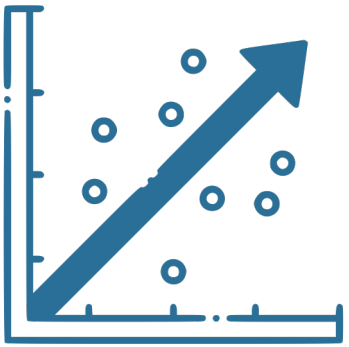
☐ **d.** Recognize multiple functional forms

☐ **e.** Use derivatives to find tipping point.

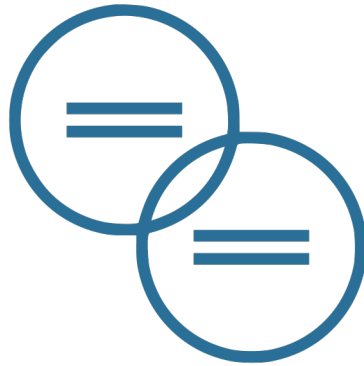
☐ **f.** Recognize differences about percent changes

☐ **g.** Ramsey Reset Test

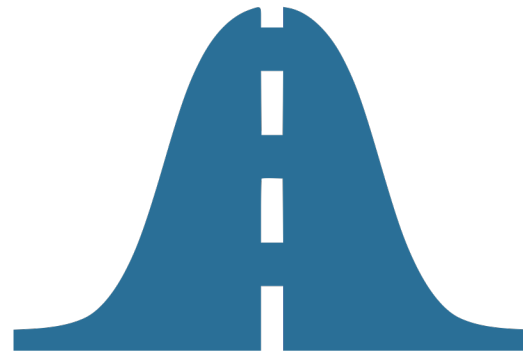
Assumptions associated with **linear regression**



Linearity



Homoscedasticity



Normality



Independence

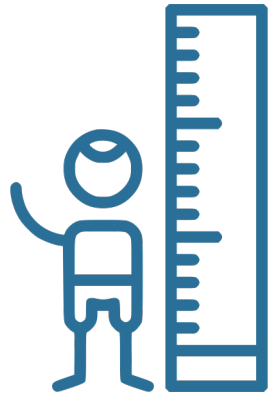
Properties of **estimators**

Unbiasedness



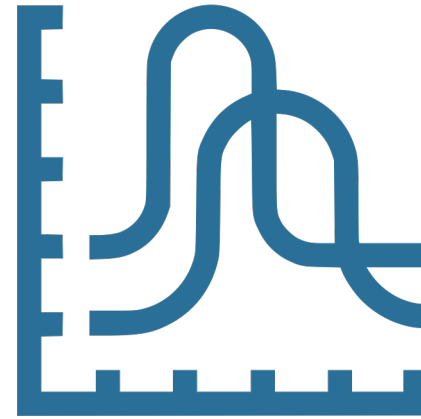
If expected value is identical to population parameter

Consistency



Estimator approaches parameter as sample size increases

Efficiency



If two estimators are unbiased, we choose the one with smaller variance (it is efficient)

Sufficiency



It is sufficient if information in it about the parameter is enough

Okay but...what is the
importance of functional
form?

Think about the complex world
which is not always linear...how
can we show a relationship that
is not linear in a linear
regression?



Importance of **functional form**

We use *linearity*

“linearity in parameters but not necessarily in variables”

$$Y_1 = b_0 + b_1 X_{1i} + b_2 X_{2i}^2 + u_i$$

For example:

$$Wage_1 = \underbrace{b_0}_{\text{Linear}} + \underbrace{b_1 exp_i}_{\text{Linear}} + \underbrace{b_2 exp_i}_{\text{Not linear}} + \underbrace{b_3 exp_i^2}_{\text{Not linear}} + u_i$$

Importance of **functional form**

Let's check **several functional forms** used in **econometrics** and other **related fields**

Linear

$$Y = \beta_1 + \beta_2 X$$

Log-Linear or log-log

$$\ln Y = \beta_1 + \beta_2 \ln X$$

Log-lin

$$\ln Y = \beta_1 + \beta_2 X$$

Lin-log

$$Y = \beta_1 + \beta_2 \ln X$$

Reciprocal

$$Y = \beta_1 + \beta_2 \left(\frac{1}{x} \right)$$

Log-Reciprocal

$$\ln Y = \beta_1 - \beta_2 \left(\frac{1}{x} \right)$$

Models

In this workshop we will review some of the most
important regression models such as

Log-linear model

Semi-log models

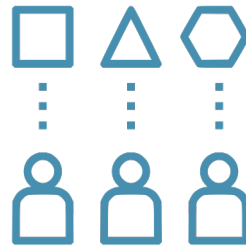
Log-log models

Models

You have to **ask** yourself about



Why this model?



Characteristics




Appropriate cases

Log-Linear model

Economists love the rate of growth in some **economic variables** such as population, GDP, monetary supply, employment...

Notice that **just one side** of the equation is logarithmic

Log side


$$\ln Y_1 = \beta_0 + \beta_1 X_{1i} + \beta_2 X_{2i}^2 + u_i$$

or

$$Y_1 = \beta_0 + \beta_1 \ln X_{1i} + \beta_2 \ln X + u_i$$



Log side

Log-Linear **model**

The difference is on the assigned variable

Log side



$$\ln Y_1 = \beta_0 + \beta_1 X_{1i} + \beta_2 X_{2i}^2 + u_i$$

log - lin

or

$$Y_1 = \beta_0 + \beta_1 \ln X_{1i} + \beta_2 \ln X + u_i$$




Log side

lin - log

Log-Linear model

Log side


$$\ln Y_1 = \beta_0 + \beta_1 X_{1i} + \beta_2 X_{2i}^2 + u_i$$

log - lin

Estimated percentage change in your dependent variable for a unit change in your independent variable

or

$$Y_1 = \beta_0 + \beta_1 \ln X_{1i} + \beta_2 \ln X + u_i$$

lin - log

Estimated unit change in your dependent variable for a percentage change in your independent variable



Log side

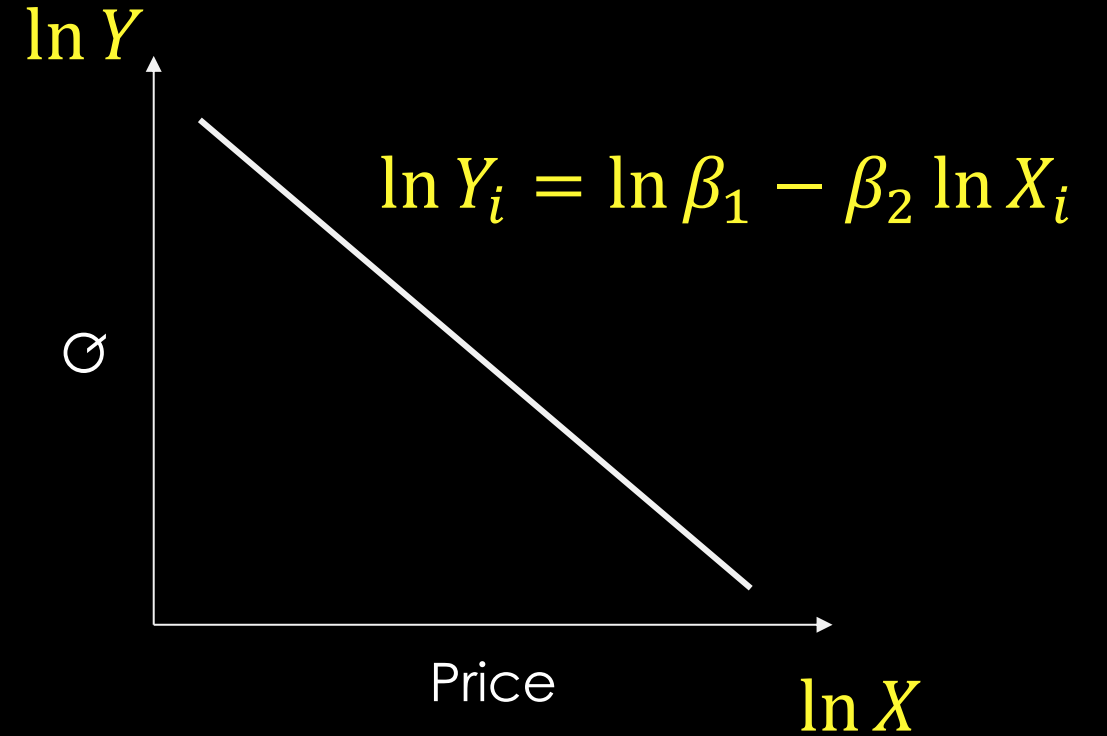
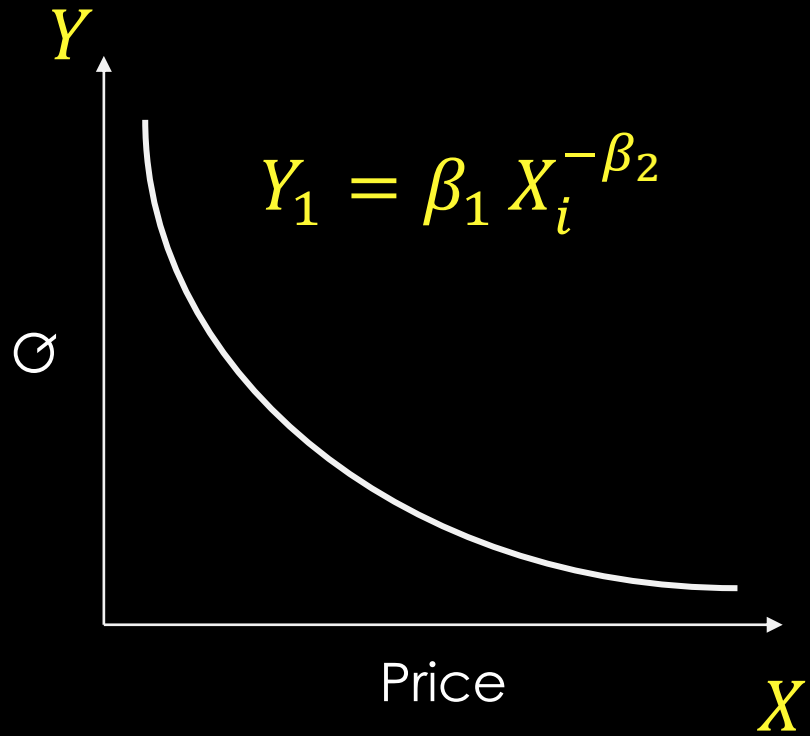
On the other hand, if we want to use elasticities we adopt a log-log model

$$Y_i = \beta_1 X_i^{\beta_2} + e^{u_i}$$

or

$$\ln Y_i = \alpha + \beta_2 \ln X_i + u_i$$

Log-Log model



Log-Log **model**

What we may focus on is the slope β_2 which measures the elasticity of Y respect to X

or

the percentage change in Y for a small percentage change in X

NOTE: there is a difference between percentage change and percentage points

For example, the rate of unemployment is stated as percentage

Imagine that Mexico unemployment rate for 2019 is 4%, but in 2020 it grows to 8%

It is said that the percentage point change in unemployment rate is 2

but

The percentage change is $\frac{8-4}{4}$ or $\approx 100\%$



Log-Log **model**

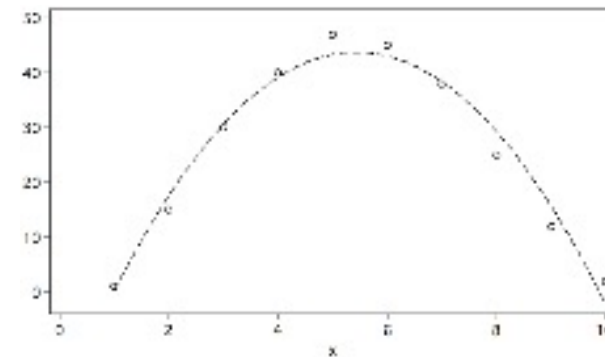
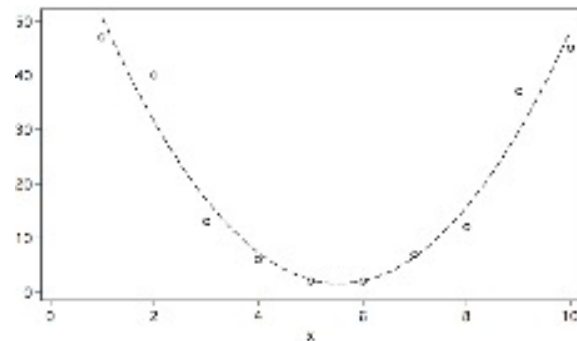
Suppose we have the [following](#) equation

$$y = \alpha + \beta_1 X_1 + \beta_2 X_2^2$$

Stata will output these [coefficients](#)

| Model A | Coef. |
|----------|-----------|
| x | -.1839751 |
| x2 | 1.016747 |
| constant | .2076584 |

| Model D | Coef. |
|----------|-----------|
| x | .1839751 |
| x2 | -1.016747 |
| constant | 99.79234 |



The data set in [MUS08](#) contains data panel information about [wages and salaries](#) in the USA from 1976-1982.

Then we plot the [relationship between salary and experience](#).

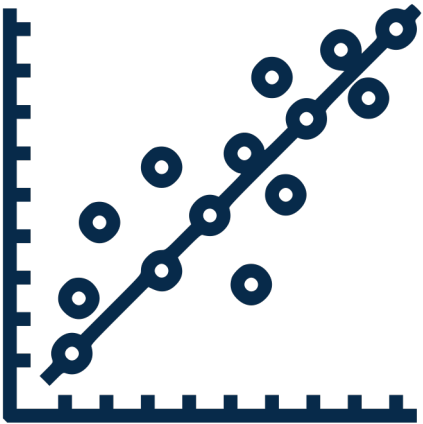
Finally, generate [linear regression](#) with `lwage` as dependent and `exp`, `exp2`, `wks` and `ed` as independent.

STATA COMMANDS

1. `graph twoway (scatter lwage exp) (qfit lwage exp) (lowess lwage exp)`
2. `regress lwage exp exp2 wks ed`

Practice (**Quadratic**)

We can **read** the output as:



$$R^2 = 0.28$$



Salaries **increase** in 0.6% for each **additional work week**



Salaries **increase** in 0.6% for each **additional year of education**

Practice (Tipping point)

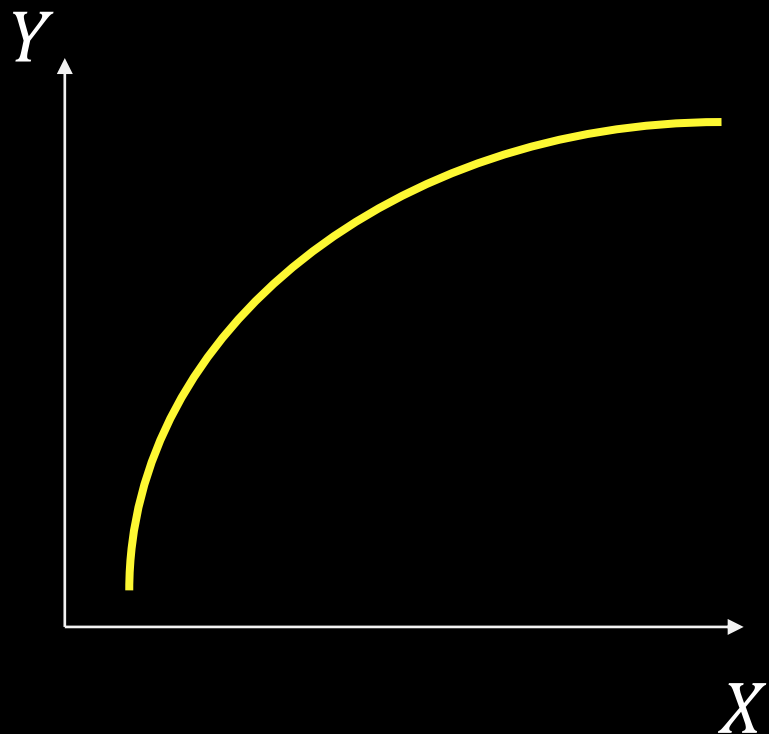
How to find the slope of the curve?

Key: look into x_2^2

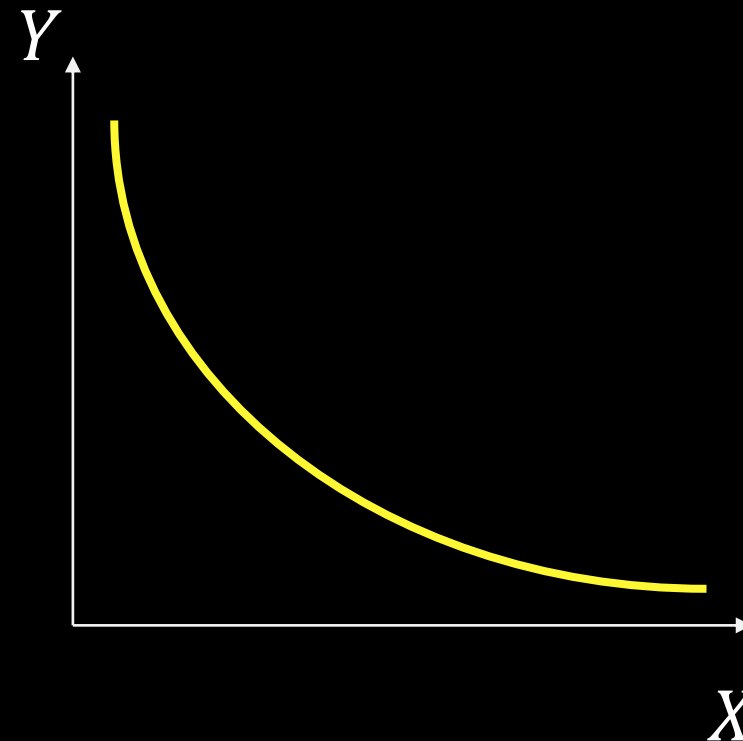
$$y = \beta_0 + \beta_1 X_1 + \beta_2 X_2^2$$

Practice (Tipping point)

$$y = \beta_0 + \beta_1 X_1 + \beta_2 X_2^2$$



$$y = \beta_0 + \beta_1 X_1 - \beta_2 X_2^2$$



Practice (Tipping point)

$$y = \beta_0 + \beta_1 X_1 + \beta_2 X_2^2$$

How to find the tipping point?

Key: solve it

Then calculate the derivative with respect to X

$$y' = \beta_1 + 2\beta_2 X_2$$

Finally, equal to zero and solve for finding tipping points

Practice (Tipping point)

1. State the **output** in econometrics terms

$$\hat{y} = 4.097 + 0.44675 \exp - 0.00072 \exp^2 + 0.0058wks + 0.7604ed + \varepsilon$$

2. If we take **first derivative** respect to exp we have

$$y' = 0.4467 - (2 \times (0.00072) \exp)$$

3. If we **solve** for **exp** we have:

$$\exp = \frac{0.4467}{2 \times 0.00072} = 31$$

Practice (Tipping point)

We can read the output as:



Salaries increase as experience grows up to 31 years
 $\frac{0.0447}{(2 \times 0.00072)}$ and from there it decreases

Functional forms

```
graph TD; A[Functional forms] --> B[Linear model]; A --> C[Model Lin-Log]; A --> D[Model Log-Lin]; A --> E[Model Log-Log]; B --> F["Absolut change of Y with respect to a change in X"]; C --> G["Absolut change of Y with respect to a percentage change in X"]; D --> H["Percentage change of Y with respect to an absolute change in X"]; E --> I["Percentage change of Y with respect to a percentage change in X"]; I --> J["Coefficient  $\beta_2$  measures elasticity of Y with respect to X"];
```

Linear model

Absolut change of Y with respect to a change in X

Model Lin-Log

Absolut change of Y with respect to a **percentage change** in X

Model Log-Lin

Percentage change of Y with respect to an **absolute change** in X

Model Log-Log

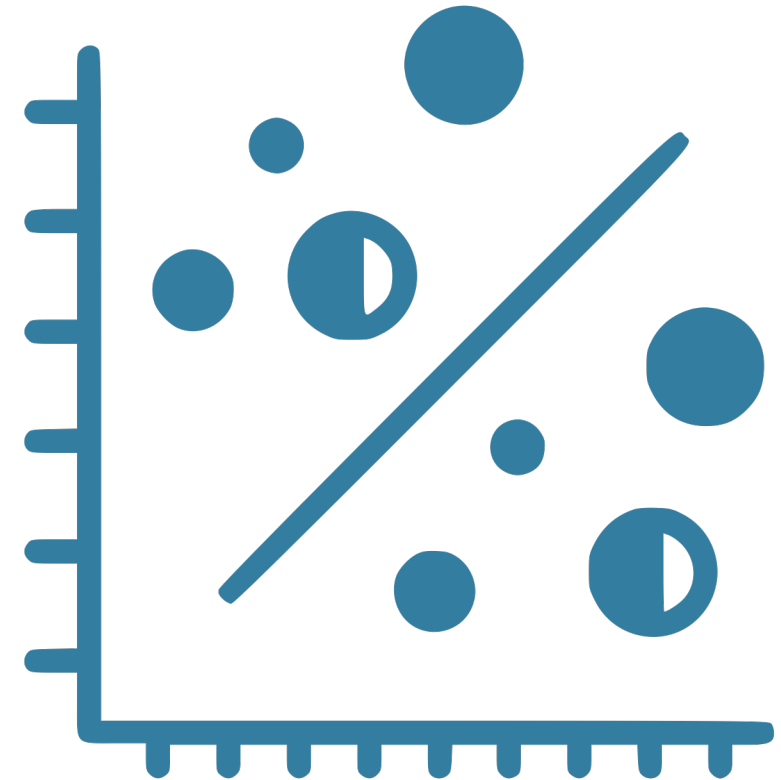
Percentage change of Y with respect to a **percentage change** in X

Coefficient β_2 measures **elasticity** of Y with respect to X

Ramsey Regression Equation Specification Error Test (RESET) is a general specification test for linear regression models

It tries to prove if non-linear combinations of adjusted values have any explanatory force over dependent variable

If any of this non-linear combinations have explanatory influence over Y , then model is specified incorrectly



We use `auto.dat` dataset. We will try to explain `car prices` depending on `mileage`, `weight`, `engine capacity`, and whether car was `produced in USA` or not.

Run a linear regression.

Standardize data (mean 0 and variance 1).

Then we generate powers over adjusted values (y^2, y^3, y^4).

Finally we run the regression using powers.

STATA COMMANDS

1. `reg price mpg weight foreign`
2. `predict y`
3. `sum y`
4. `replace y = (y-r(mean))/r(sd))`
5. `gen y2 = y^2`
6. `gen y3 = y^3`
7. `gen y4 = y^4`
8. `reg price mpg weight foreign y2 y3 y4`

We will prove coefficient significance in order to inspect powers using F test (apply test over linear constraint)

Due to output, we cannot reject H_0 , our model is well specified.

Then, apply Ramsey test over well specified form.

What is the conclusion?

STATA COMMANDS

```
9. test y2 y3 y4
```

```
10. reg price mpg weight foreign
```

```
11. ovtest
```

References

- **Salvatore, D., & Sarmiento, J. C.** (1983). *Econometría* (No. HB141 S39). McGraw-Hill.
- **Kumari K., J. Pract Cardiovasc, Wooldridge, J.** (2020). *Introductory econometrics : a modern approach*. Boston, MA: Cengage. Gujarati, D. & Porter, D. (2009). *Basic econometrics*. Boston: McGraw-Hill Irwin.
- **Gujarati, D. N.** (2009). *Basic econometrics*. Tata McGraw-Hill Education.