

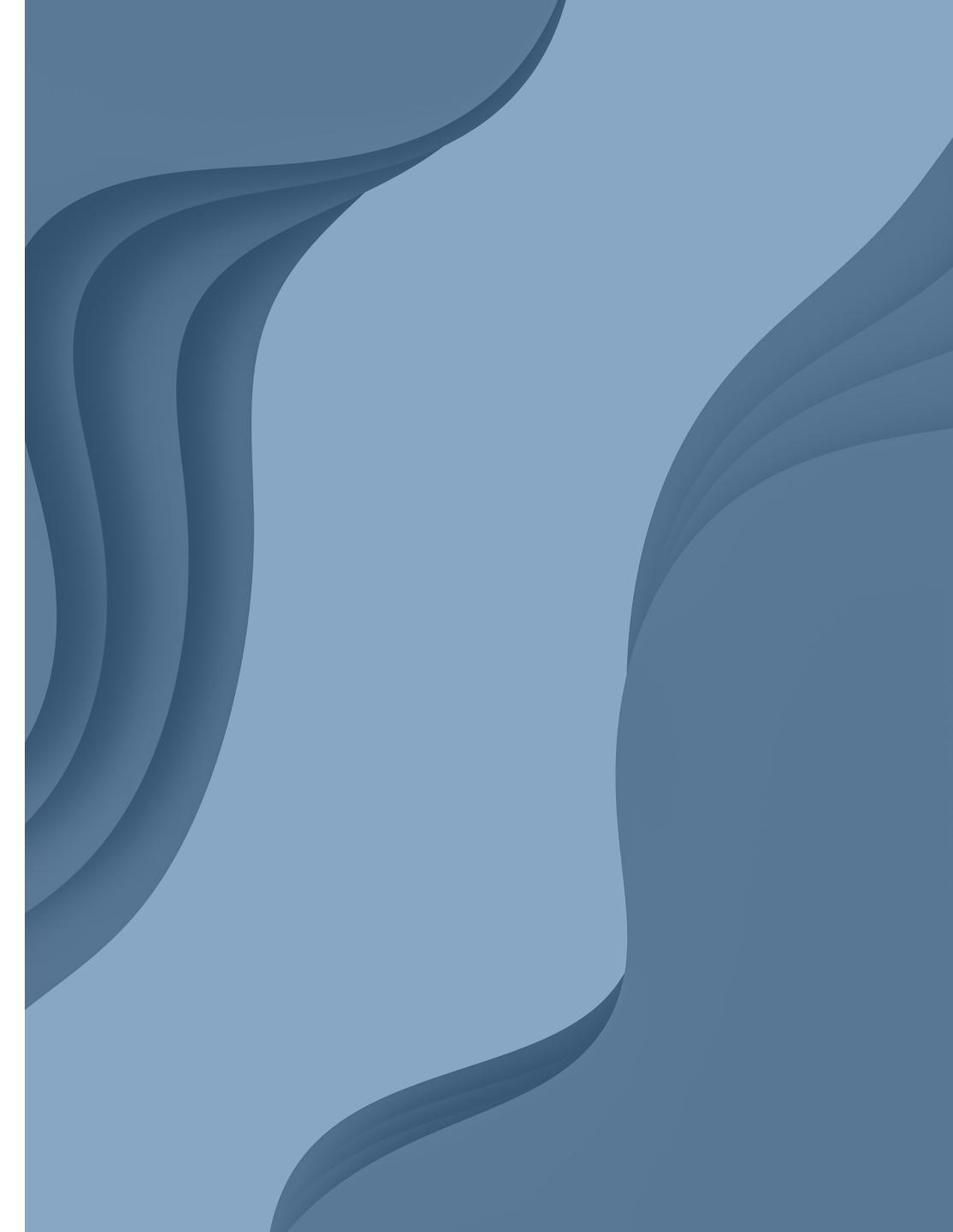


Econometrics I

Workshop I

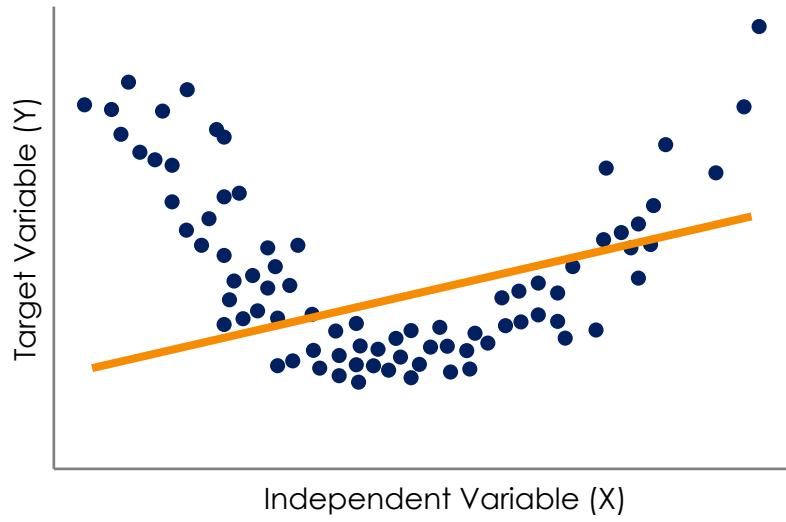
Feb 14, 2023

# Functional Form

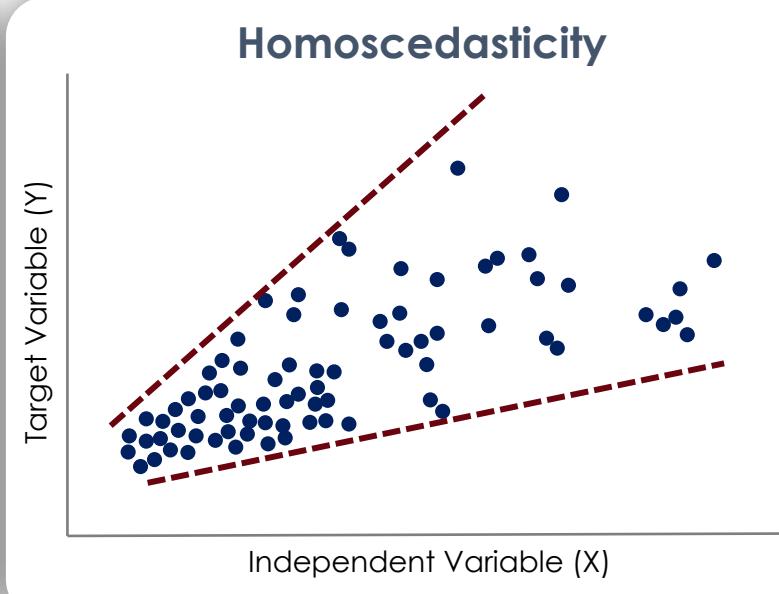


# OLS Assumptions

## Linearity



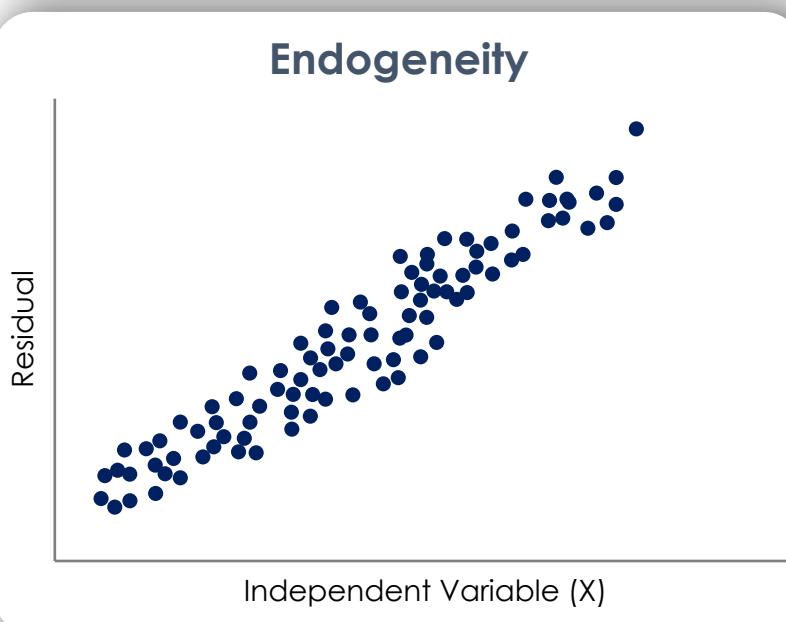
## Homoscedasticity



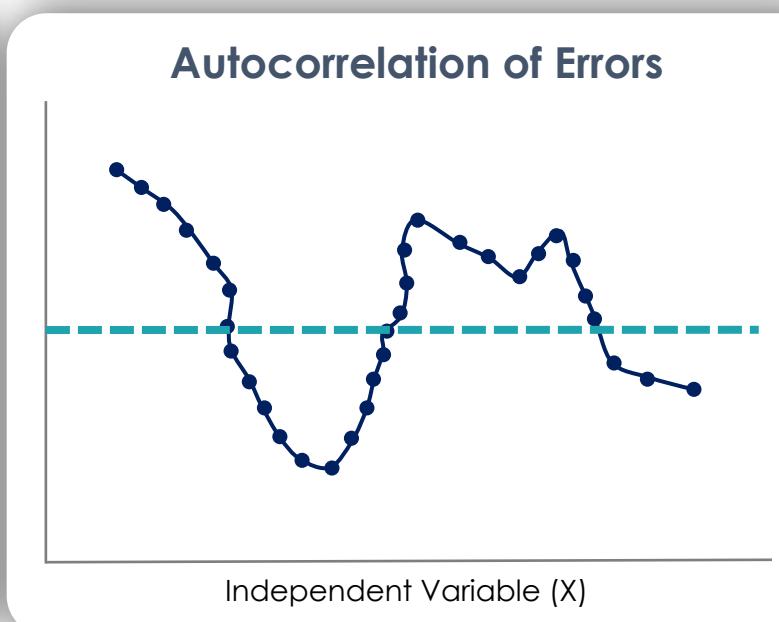
## Zero-Mean Errors



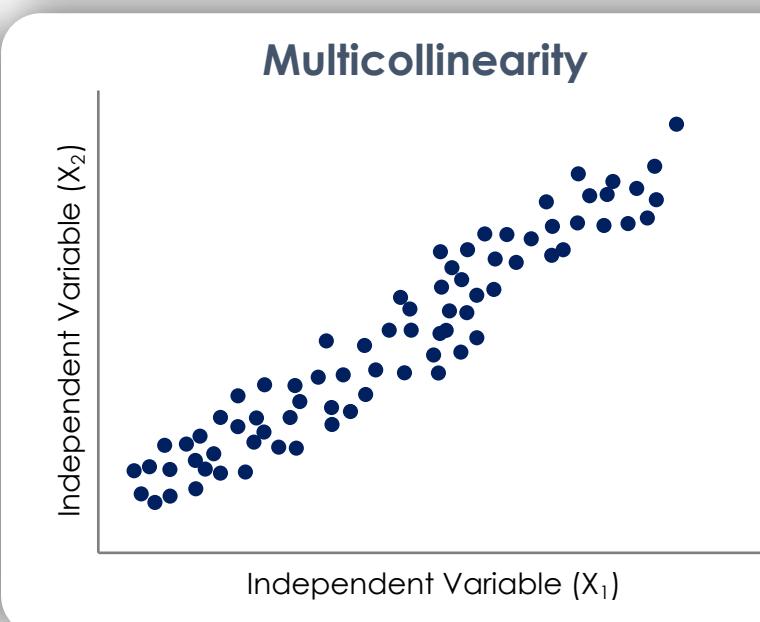
## Endogeneity



## Autocorrelation of Errors



## Multicollinearity



## Properties of estimators

### Unbiasedness



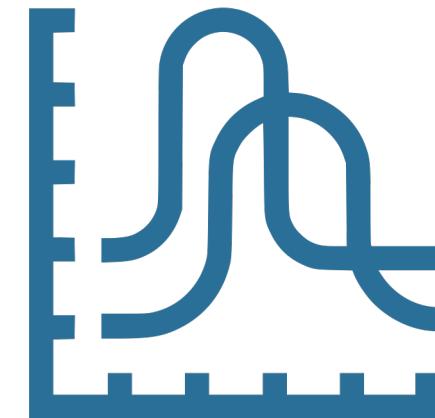
If expected value is identical to population parameter

### Consistency



Estimator approaches parameter as sample size increases

### Efficiency



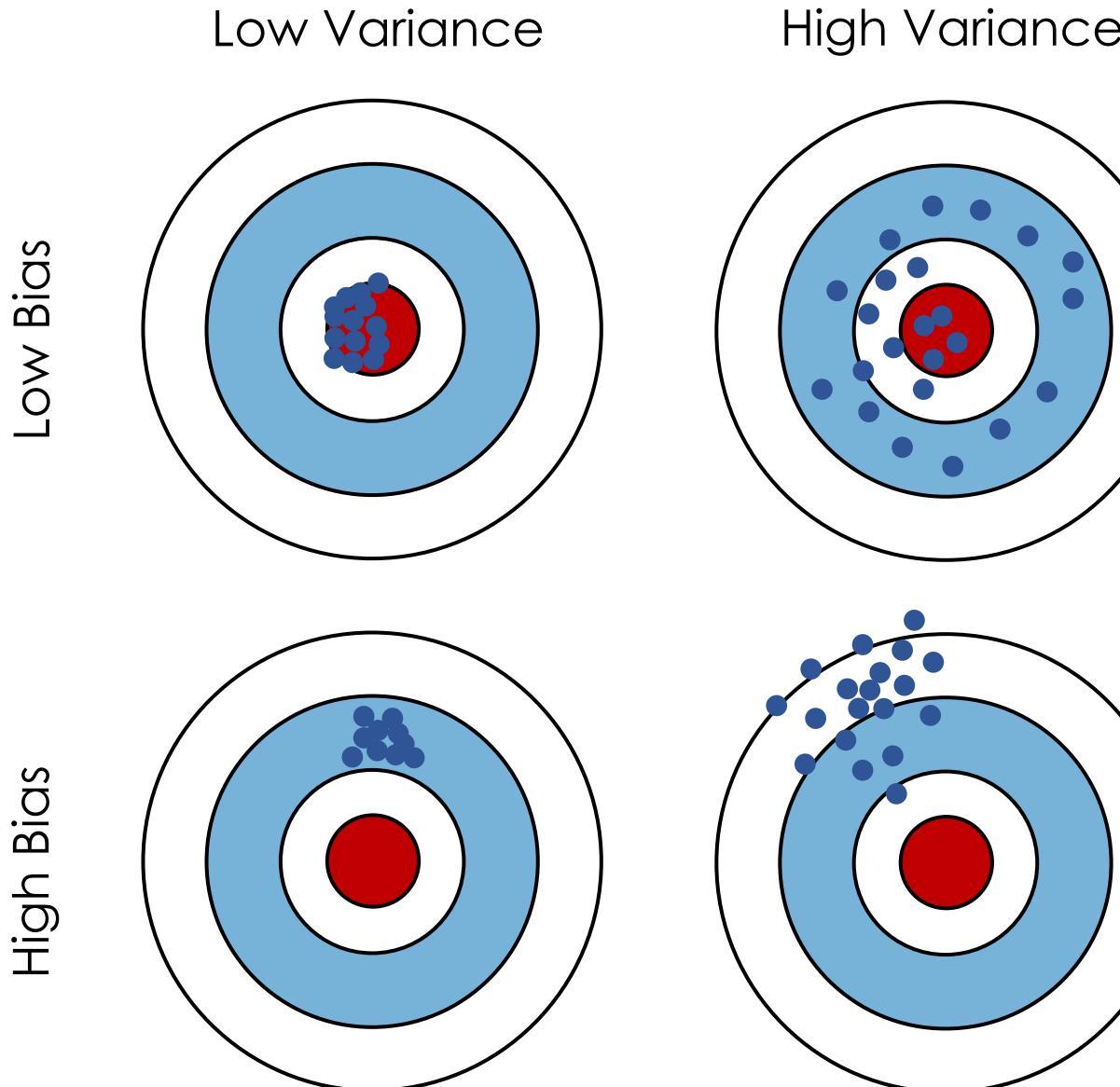
If two estimator are unbiased, we choose the one with smaller variance (it is efficient)

### Sufficiency

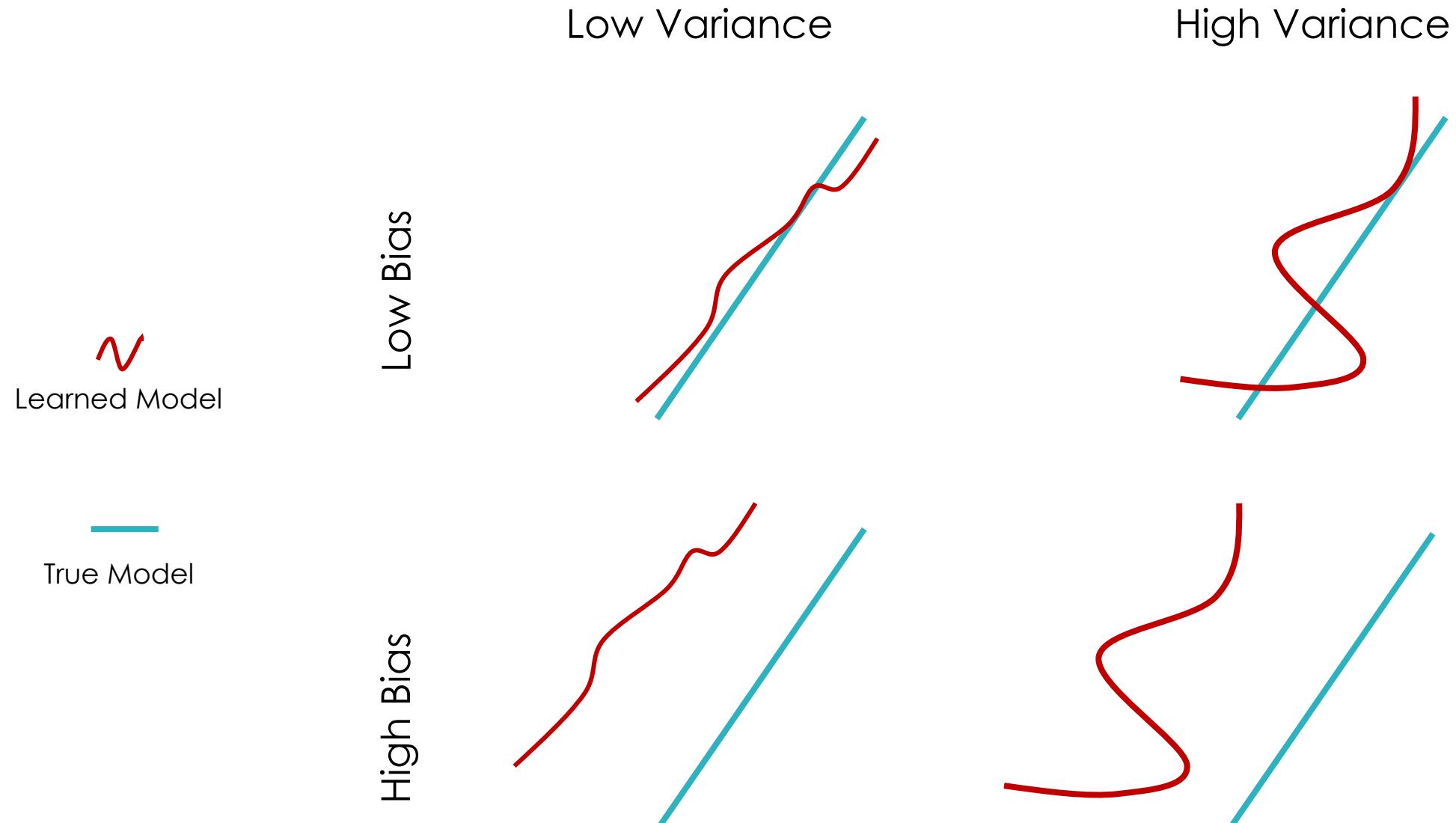


It is sufficient if information in it about the parameter is enough

## Bias and Variance



## Bias and Variance



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?



“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:

$$Wage_1 = \frac{b_0}{\text{Linear}} + \frac{b_1 exp_i}{\text{Linear}} + \frac{b_2 exp_i}{\text{Linear}} + \frac{b_3 exp_i^2}{\text{Linear}} + u_i$$

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

Linear

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

Log-Linear (log-log)

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

Log-lin

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

Lin-log

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

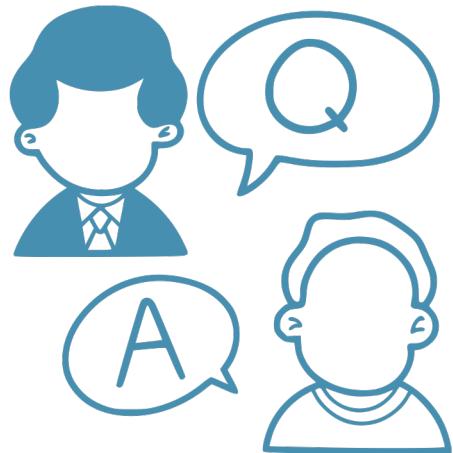
Reciprocal

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

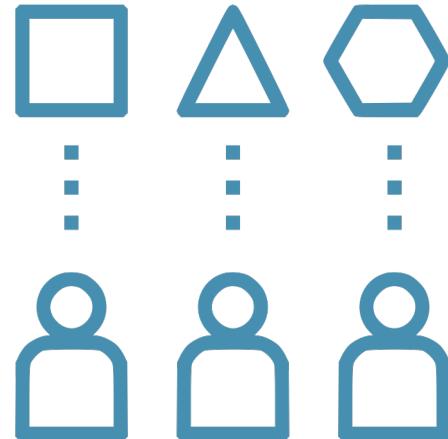
Log-Reciprocal

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

You have to **ask** yourself about



Why this  
model?



Characteristics

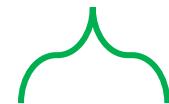


Appropriate  
cases

Economists look for **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



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

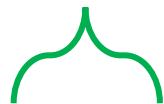
or

$$Y_1 = \underbrace{\beta_0 + \beta_1 \ln X_{1i}}_{\text{Log side}} + \beta_2 \ln X + u_i$$

Log side

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

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

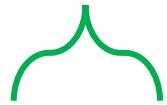


Log side

lin - log

## Log-Linear model

Log side



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

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

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



Log side

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

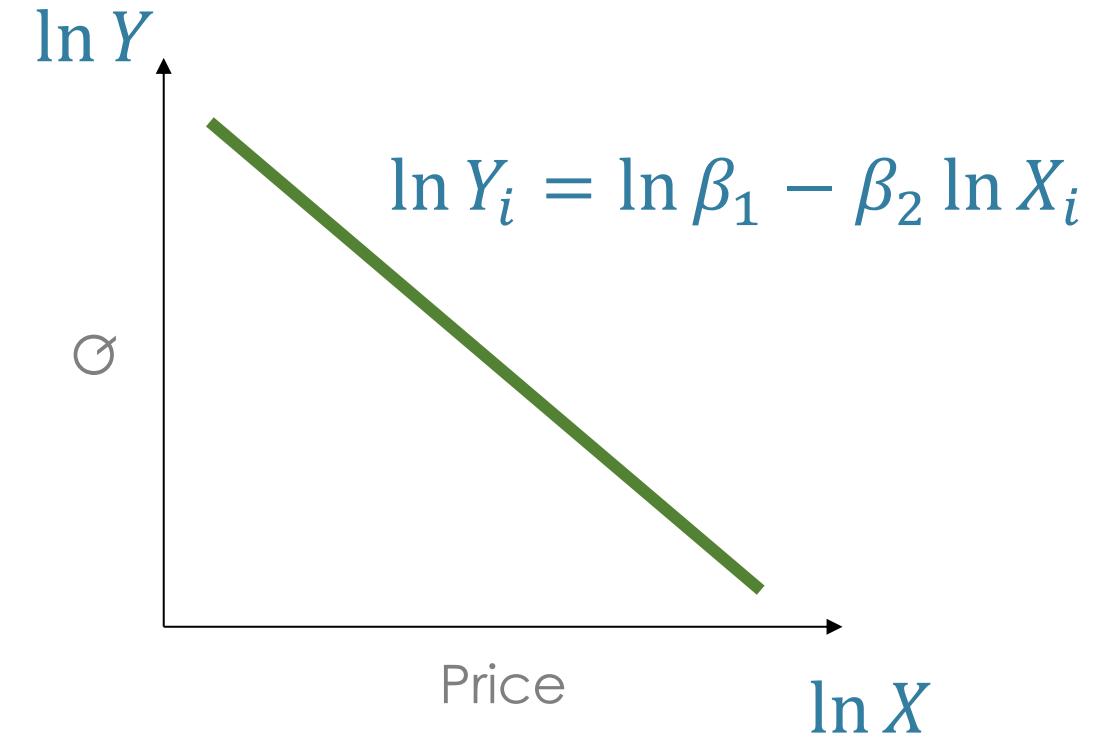
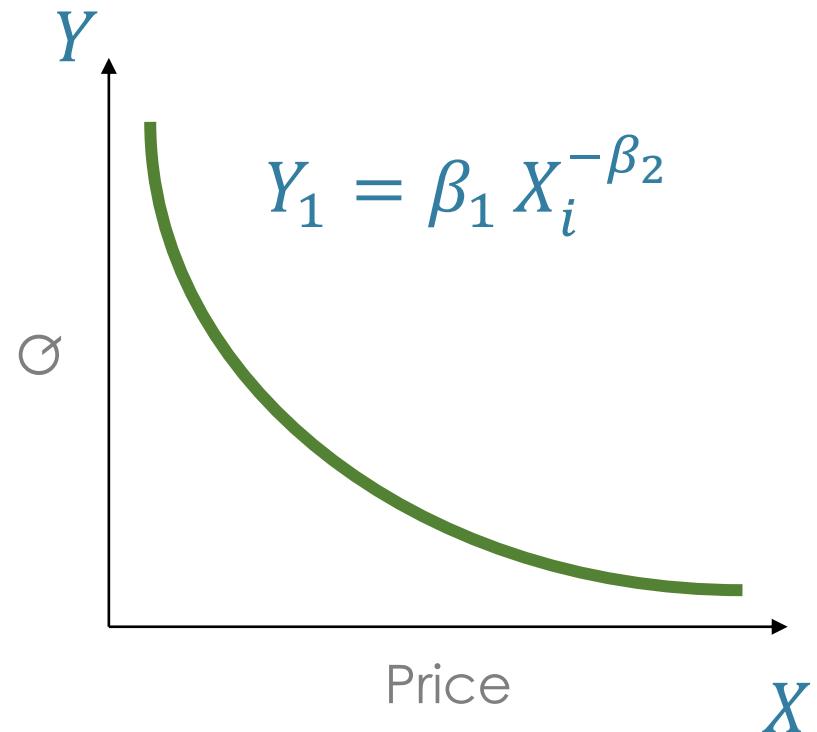
On the other hand, if we want to use elasticities we adopt a log-log model

$$Y_1 = \beta_1 X_i^{\beta_2} + e^{ui}$$

or

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

### Log-Log model



What we may focus on is the slope  $\beta_2$   
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  $\frac{8-6}{6}$  or  $\approx 33\%$



## Log-Log model

Suppose we have the following equation

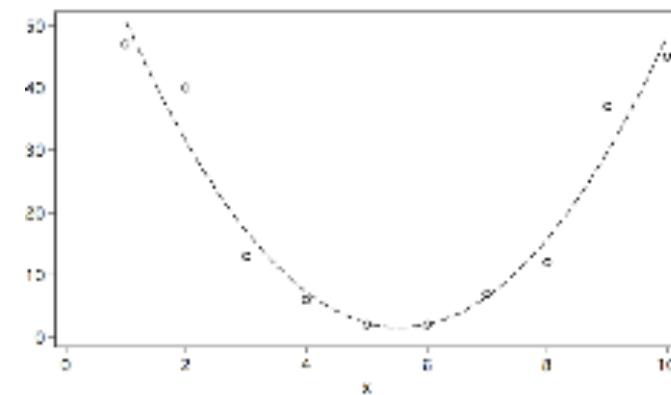
$$y = \alpha + \beta_1 X_1 + \beta_2 X_2^2$$

Stata will output these coefficients

---

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

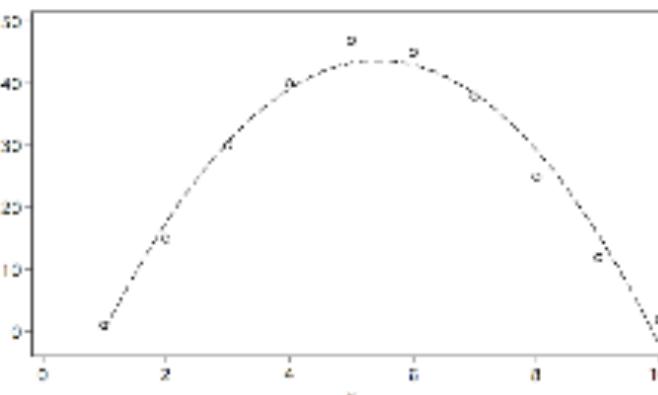
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Model D   Coef.	
x   .1839751	
x2   -1.016747	
constant   99.79234	

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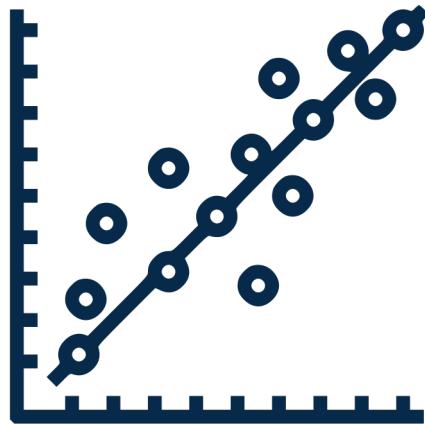


The data set in MUS08 contains data panel information about wages and salaries in the USA from 1976-1982.



```
// Plot the relationship between salary and experience  
graph twoway (scatter lwage exp) (qfit lwage exp) (lowess lwage exp)  
  
// Generate linear regression with lwage as dependent and exp, exp2, wks and ed as independent  
regress lwage exp exp2 wks ed
```

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

How to find the  
slope of the curve?

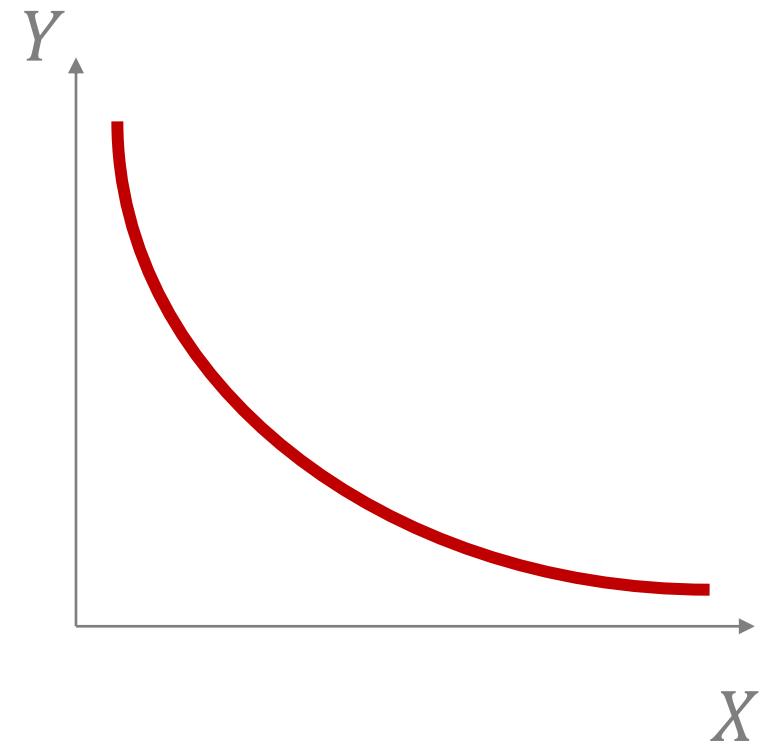
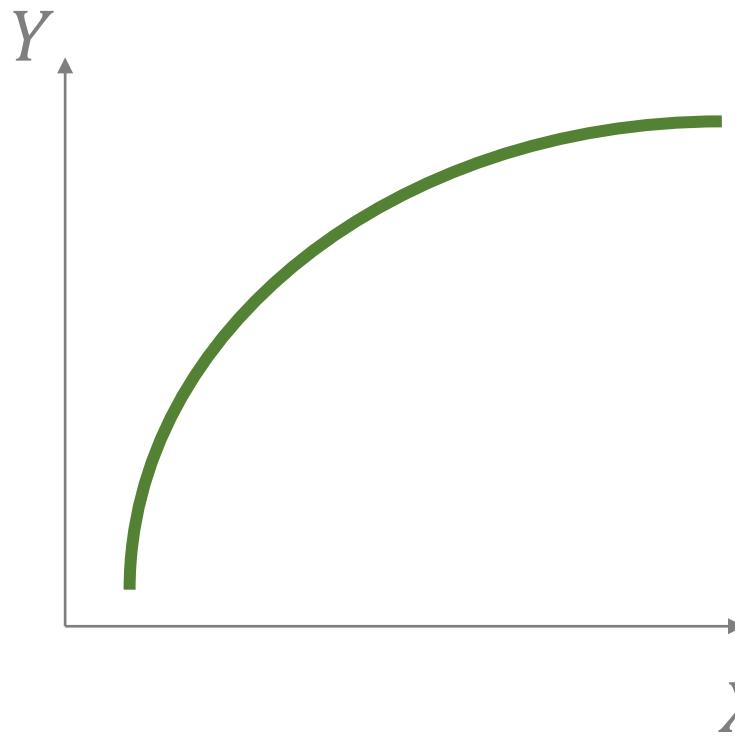
Hint: look into  $x_2^2$

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

Practice (Tipping point)

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

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



How to find the  
tipping point?

By solving for it

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

Then calculate the derivative  
with respect to X

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

Finally, equal to zero and  
solve for finding tipping  
points

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

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

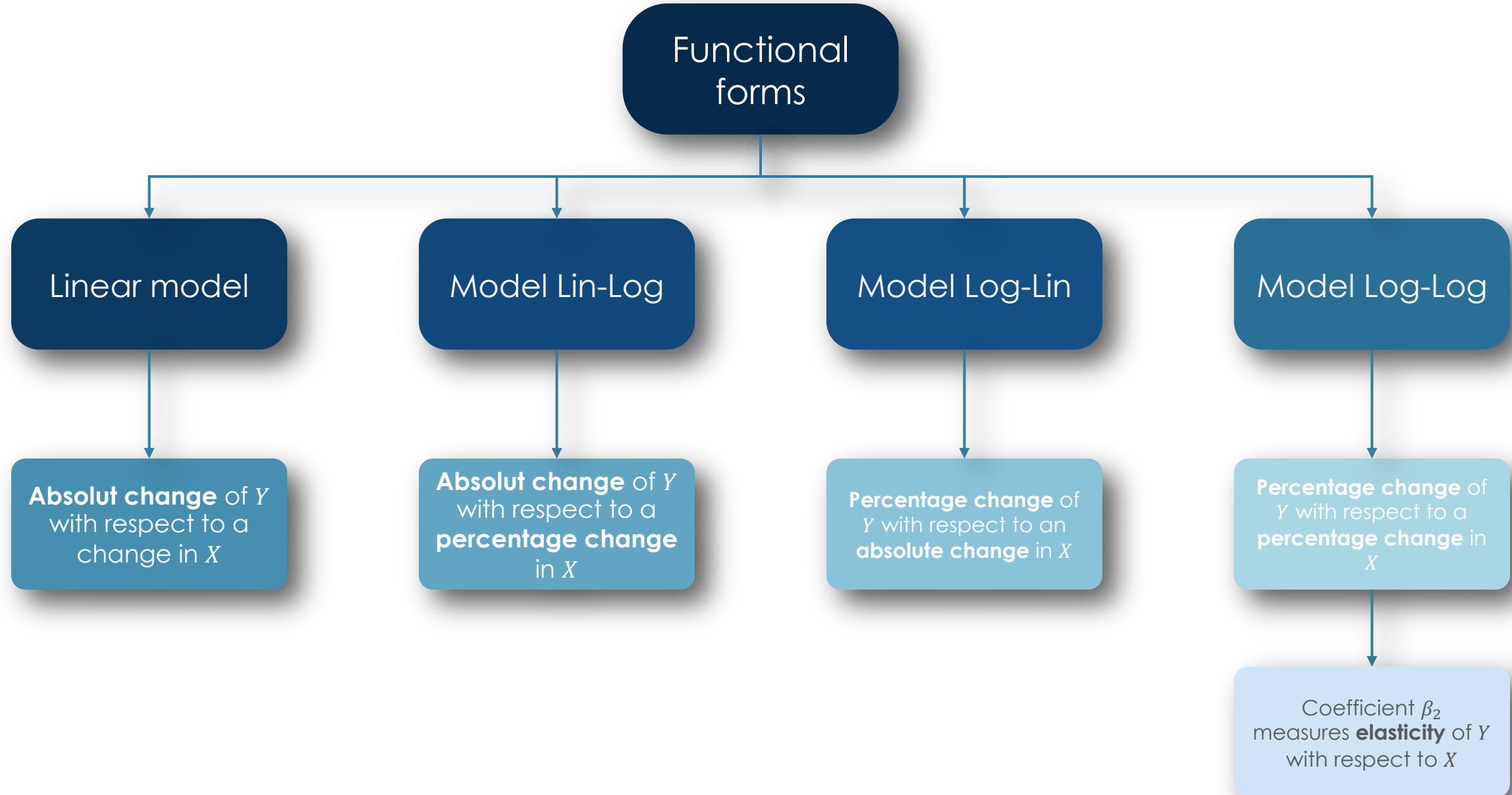
3. If we **solve** for  $\exp$  we have:

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

We can **read** the output as:



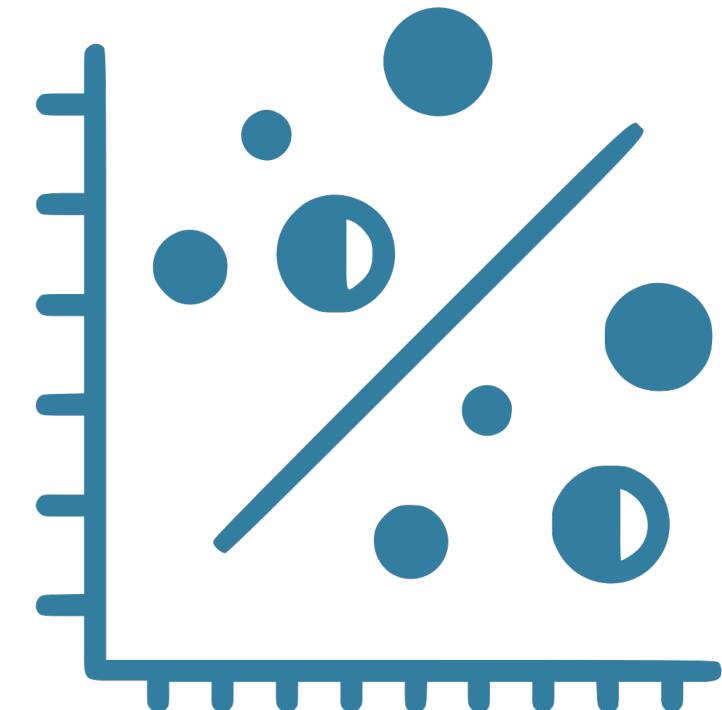
Salaries **increase** as experience grows up to 31 years  $\frac{0.0447}{(2 \times 0.00072)}$  and from there it **decreases**



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  
reg price mpg weight foreign  
  
// Predict over y  
pred y  
  
// Sum all values of y  
sum y  
  
// Standardize data (mean 0 and variance 1)  
replace y = (y-r(mean))/r(sd)  
  
// Then we generate powers over adjusted values (y^2,y^3,y^4)  
gen y2 = y^2  
gen y3 = y^3  
gen y4 = y^4  
  
// Finally we run the regression using powers  
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)  
test y2 y3 y4  
  
// Due to output, we cannot reject H_0, our model is well specified  
reg price mpg weight foreign  
  
// Then, apply Ramsey test over well specified form  
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.