

EE 325

Two-Variable Regression Analysis: Some Basic Ideas

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Simple Regression model

- Two variable linear regression model
- Bivariate linear regression model

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

Y and X are two variables, representing some population

- Explaining Y in terms of X
- Studying how Y varies with changes in X

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Example

- A total population of 60 families in a hypothetical community and their weekly income (X) and weekly consumption expenditure (Y), both in dollars
- The 60 families are divided into 10 income groups

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

| Y \ X | 80 | 100 | 120 | 140 | 160 | 180 | 200 | 220 | 240 | 260 |
|---|-----------|-----------|-----------|------------|------------|------------|------------|------------|------------|------------|
| Weekly family consumption expenditure Y, \$ | 55 | 65 | 79 | 80 | 102 | 110 | 120 | 135 | 137 | 150 |
| 60 | 70 | 84 | 93 | 107 | 115 | 136 | 137 | 145 | 152 | |
| 65 | 74 | 90 | 95 | 110 | 120 | 140 | 140 | 155 | 175 | |
| 70 | 80 | 94 | 103 | 116 | 130 | 144 | 152 | 165 | 178 | |
| 75 | 85 | 98 | 108 | 118 | 135 | 145 | 157 | 175 | 180 | |
| - | 88 | - | 113 | 125 | 140 | - | 160 | 189 | 185 | |
| - | - | - | 115 | - | - | - | 162 | - | 191 | |
| Total | 325 | 462 | 445 | 707 | 678 | 750 | 685 | 1043 | 966 | 1211 |
| $E(Y X)$ | 65 | 77 | 89 | 101 | 113 | 125 | 137 | 149 | 161 | 173 |

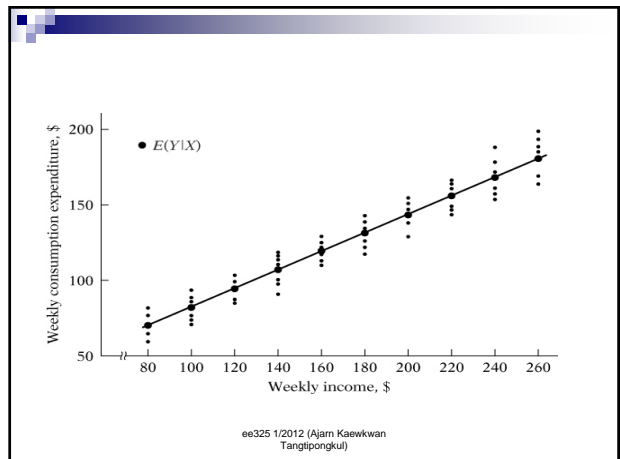
ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Conditional expected values

$$E(Y | X)$$

The expected value of Y given the value of X

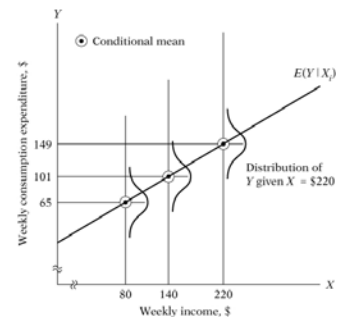
ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)



Population regression line (PRL)

- A population regression curve is simply the locus of the conditional means of the dependent variable for the fixed values of the explanatory variable (s)

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)



ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Population Regression Function (PRF)

- Conditional Expectation Function (CEF)
- Population Regression Function (PRF)
- Population Regression (PR)

$$E(Y | X_i) = f(X_i)$$

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Linear population regression function

$$E(Y | X_i) = \beta_1 + \beta_2 X_i$$

β_1 is known as intercept

β_2 is known as slope coefficients

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Linear

- Linear in the Variables
- Linear in the Parameters

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Linear in the variables

- The regression curve is a straight line
- X's are raised to the first power only

$$E(Y | X_i) = \beta_1 + \beta_2 X_i$$

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

Linear in the Parameters

- The conditional expectation of Y is a linear function of the parameters, the β 's
- May or may not be linear in the variable X

$$Y = \beta_1 + \beta_2 X + \beta_3 X^2$$

$$Y = \beta_1 + \beta_2 X + \beta_3 X^2 + \beta_4 X^3$$

$$Y = e^{\beta_1 + \beta_2 X}$$

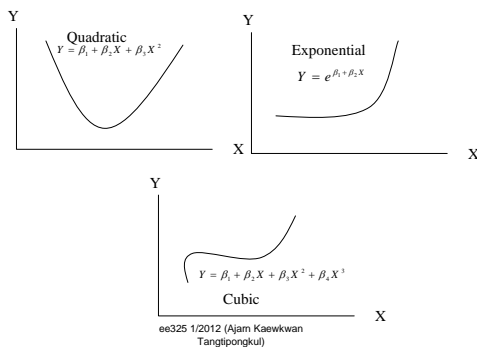
ee325 1/2012 (Ajarn Kaewkwan
Tangtipongkul)

Linear regression

- Linear regression will always mean a regression that is linear in the parameters; the β 's are raised to the first power only.
- May or May not be linear in the explanatory variables, the X's

ee325 1/2012 (Ajarn Kaewkwan
Tangtipongkul)

Linear in parameter functions



ee325 1/2012 (Ajarn Kaewkwan
Tangtipongkul)

Are the following models linear regression models?

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

b. $\ln Y_i = \beta_1 + \beta_2 \left(\frac{1}{X_i} \right) + u_i$

c. $Y_i = \beta_1 + \beta_2^3 X_i + u_i$

d. $\ln Y_i = \beta_1 + \beta_2 X_i + u_i$

ee325 1/2012 (Ajarn Kaewkwan
Tangtipongkul)

Stochastic Specification of PRF

The deviation of an individual Y_i around its expected value as follows:

$$u_i = Y_i - E(Y | X_i)$$

$$Y_i = E(Y | X_i) + u_i$$

ee325 1/2012 (Ajarn Kaewkwan
Tangtipongkul)

Stochastic Specification of PRF

How do we interpret this equation?

$$Y_i = E(Y | X_i) + u_i$$

- (1) $E(Y | X_i)$ is the mean consumption expenditure of all the families with the same level of income- This component is known as the **systematic or deterministic component**

- (2) u_i is the random or nonsystematic component

ee325 1/2012 (Ajarn Kaewkwan
Tangtipongkul)

$$E(Y_i | X_i) = E[E(Y | X_i)] + E(u_i | X_i)$$

$$= E(Y | X_i) + E(u_i | X_i)$$

$$E(u_i | X_i) = 0$$

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

The Significance of the Stochastic Disturbance Term

- Vagueness of theory
- Unavailability of data
- Intrinsic randomness in human behavior
- Poor proxy variables
- Wrong functional form

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

The Sample Regression Function (SRF)

A Random Sample from the Population of Table 2.1

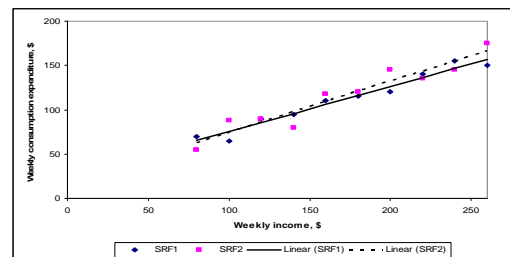
| Y | X |
|-----|-----|
| 70 | 80 |
| 65 | 100 |
| 90 | 120 |
| 95 | 140 |
| 110 | 160 |
| 115 | 180 |
| 120 | 200 |
| 140 | 220 |
| 155 | 240 |
| 150 | 260 |

Another Random Sample from the Population of Table 2.1

| Y | X |
|-----|-----|
| 55 | 80 |
| 88 | 100 |
| 90 | 120 |
| 80 | 140 |
| 118 | 160 |
| 120 | 180 |
| 145 | 200 |
| 135 | 220 |
| 145 | 240 |
| 175 | 260 |

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

The Sample Regression Function (SRF)



ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

The Sample Regression Function (SRF)

$$\hat{Y}_i = \hat{\beta}_1 + \hat{\beta}_2 X_i$$

\hat{Y}_i = estimator of $E(Y | X_i)$

$\hat{\beta}_1$ = estimator of β_1

$\hat{\beta}_2$ = estimator of β_2

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

The PRF

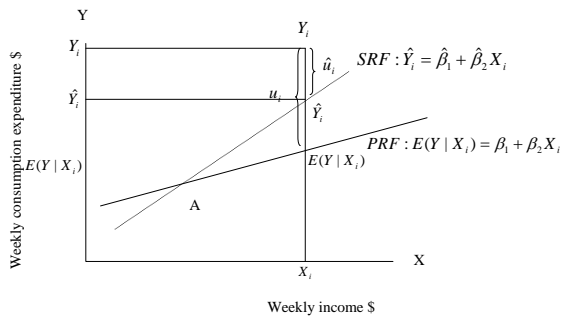
$$Y_i = \beta_1 + \beta_2 X_i + u_i$$

On the basis of the SRF

$$Y_i = \hat{\beta}_1 + \hat{\beta}_2 x_i + \hat{u}_i$$

ee325 1/2012 (Ajarn Kaewkwan Tangtipongkul)

The Sample Regression Function (SRF)



ee325 1/2012 (Ajam Kaewkwan
Tangtipongkul)

Illustrative Examples

Table 2.8 Data on expenditure on food and total expenditure, measured in rupees, for a sample of 55 rural households in India. (In early 2000, a U.S. dollar was about 40 Indian rupees)

Plot the data, using the vertical axis for expenditure on food and the horizontal axis for total expenditure

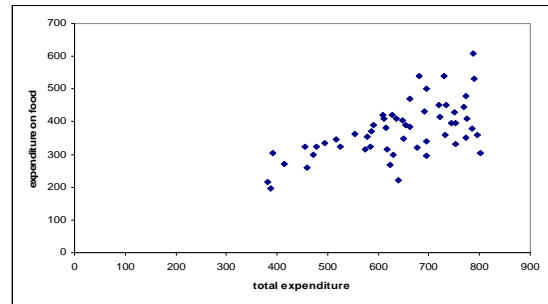
ee325 1/2012 (Ajam Kaewkwan
Tangtipongkul)

TABLE 2.8 Food and Total Expenditure (Rupees)

| Observation | Food Expenditure | Total Expenditure | Observation | Food Expenditure | Total Expenditure |
|-------------|------------------|-------------------|-------------|------------------|-------------------|
| 1 | 217.0000 | 382.0000 | 29 | 390.0000 | 655.0000 |
| 2 | 196.0000 | 388.0000 | 30 | 385.0000 | 662.0000 |
| 3 | 303.0000 | 391.0000 | 31 | 470.0000 | 663.0000 |
| 4 | 270.0000 | 415.0000 | 32 | 322.0000 | 677.0000 |
| 5 | 325.0000 | 456.0000 | 33 | 540.0000 | 680.0000 |
| 6 | 260.0000 | 460.0000 | 34 | 433.0000 | 690.0000 |
| 7 | 300.0000 | 472.0000 | 35 | 295.0000 | 695.0000 |
| 8 | 325.0000 | 478.0000 | 36 | 340.0000 | 695.0000 |
| 9 | 336.0000 | 494.0000 | 37 | 500.0000 | 695.0000 |
| 10 | 345.0000 | 516.0000 | 38 | 450.0000 | 720.0000 |
| 11 | 325.0000 | 525.0000 | 39 | 415.0000 | 721.0000 |
| 12 | 362.0000 | 554.0000 | 40 | 540.0000 | 730.0000 |
| 13 | 315.0000 | 575.0000 | 41 | 360.0000 | 731.0000 |
| 14 | 355.0000 | 579.0000 | 42 | 450.0000 | 733.0000 |
| 15 | 325.0000 | 585.0000 | 43 | 395.0000 | 745.0000 |
| 16 | 370.0000 | 586.0000 | 44 | 430.0000 | 751.0000 |
| 17 | 390.0000 | 590.0000 | 45 | 332.0000 | 752.0000 |
| 18 | 420.0000 | 608.0000 | 46 | 397.0000 | 752.0000 |
| 19 | 410.0000 | 610.0000 | 47 | 446.0000 | 769.0000 |
| 20 | 383.0000 | 616.0000 | 48 | 480.0000 | 773.0000 |
| 21 | 315.0000 | 618.0000 | 49 | 352.0000 | 773.0000 |
| 22 | 267.0000 | 623.0000 | 50 | 410.0000 | 775.0000 |
| 23 | 420.0000 | 627.0000 | 51 | 380.0000 | 785.0000 |
| 24 | 300.0000 | 630.0000 | 52 | 610.0000 | 788.0000 |
| 25 | 410.0000 | 635.0000 | 53 | 530.0000 | 790.0000 |
| 26 | 220.0000 | 640.0000 | 54 | 360.0000 | 795.0000 |
| 27 | 493.0000 | 648.0000 | 55 | 305.0000 | 801.0000 |
| 28 | 350.0000 | 650.0000 | | | |

Source: Chandan Madhugiri, Howard White, and Marc Weyss, *Economics and Data Analysis for Developing Countries*, Routledge, New York, 1998, p. 407.

ee325 1/2012 (Ajam Kaewkwan
Tangtipongkul)



ee325 1/2012 (Ajam Kaewkwan
Tangtipongkul)

- As total expenditure increases, on the average, expenditure on food also increases.
- We would not expect the expenditure on food to increase linearly for ever. Once basic needs are satisfied, people will spend relatively less on food as their income increases. That is, at higher levels of income consumers will have more discretionary income.

ee325 1/2012 (Ajam Kaewkwan
Tangtipongkul)

Source

Gujarati, D.N. (2009) *Basic Econometrics*. 5th ed. Singapore, McGraw-Hill.

ee325 1/2012 (Ajam Kaewkwan
Tangtipongkul)