Erasmus School of Economics

# **MOOC** Econometrics

Lecture 1.5 on Simple Regression:
Application

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### Estimation results

• Regression equation: Sales = a + bPrice + e

Variable	Coefficient	Standard error	t-Statistic	p-value
Intercept	a = 186.507	5.767	32.339	0.000
Price	b = -1.750	0.107	-16.380	0.000

- $R^2 = 0.725$ , s = 1.189
- 95% confidence interval  $\beta$ :

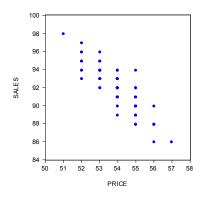
$$-1.750 - 2 \times 0.107 \le \beta \le -1.750 + 2 \times 0.107$$
  
 $-1.964 \le \beta \le -1.536$ 

- ullet On average: price 1 unit  $\downarrow$   $\rightarrow$  sales 1.5 2.0 units  $\uparrow$
- Price effect on sales is highly significant.

# Ezafus

# Effect of price on sales

• 104 weekly data



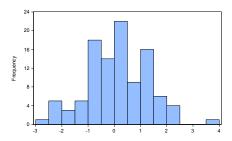
• Model: Sales =  $\alpha + \beta \text{Price} + \varepsilon$ 

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# Histogram of residuals

• e = Sales - a - bPrice



Mean = 0.000 (normal: 0, see Building Blocks)

Standard dev. = 1.183

Skewness = 0.029 (normal: 0, see Building Blocks)

Kurtosis = 3.225 (normal: 3, see Building Blocks)

Reasonably normal



# Optimal price for maximal turnover

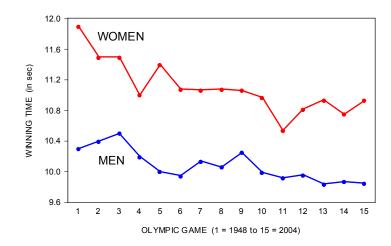
- Store manager can use regression outcomes to set price.
- Objective: maximize Turnover = Price  $\times$  Sales.
- Optimal price  $P_0 = \frac{-a}{2b}$  (see Lecture 1.1).
- a = 186.5 and b = -1.75, so  $P_0 = \frac{186.5}{3.5} = 53.3$ .
- Associated predicted sales  $S_0$ :

$$S_0 = a + bP_0 = 186.5 - 1.75 \times 53.3 \approx 93.$$

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## Olympic winning times 100 meter (athletics)



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### Confidence interval for optimal sales level

#### Test

Let S= Sales and P= Price, with model  $S=\alpha+\beta P+\varepsilon.$  Optimal price is  $P_0=-\frac{\alpha}{2\beta}$ , with associated sales  $S_0$ . Regression gives a=186.5 (SE $_a=5.767$ ), b=-1.750 (SE $_b=0.107$ ), s=1.189.

Find the (approximate) 95% confidence interval for sales if the store manager sets the price at the optimal level  $P_0$ .

Hint: First show that  $S_0 = \frac{\alpha}{2} + \varepsilon_0$ .

- Answer:  $S_0 = \alpha + \beta P_0 + \varepsilon_0 = \alpha + \beta \times (-\frac{\alpha}{2\beta}) + \varepsilon_0 = \frac{\alpha}{2} + \varepsilon_0$ 95% interval for  $\alpha$ :  $a \pm 2 \times SE_a = 186.5 \pm 2 \times 5.767 = (175, 198)$ 95% interval for  $\varepsilon_0$ :  $\pm 2 \times 1.189 = (-2.4, 2.4)$
- ullet Optimal sales: lower bound: (175/2)-2.4 pprox 85 upper bound: (198/2)+2.4 pprox 101

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### Olympic winning times 100 meter (athletics)

- W = winning time (seconds), G = game (from 1=1948 to 15=2004)
- Simple regression:  $W_i = \alpha + \beta G_i + \varepsilon_i$  (with  $G_i = i$  for i = 1, ..., 15)
- Estimation results:

	а	$SE_a$	b	$SE_b$	$R^2$
Men	10.386	0.067	-0.038	0.007	0.673
Women	11.606	0.111	-0.063	0.012	0.672

- 95% confidence intervals for *b*: men:  $-0.038 \pm 0.014$  women:  $-0.063 \pm 0.024$
- Women seem to have made most progress. Model assumes fixed gain  $\beta$  (in seconds per game).



## Model with fixed relative gains

• Maybe nonlinear trend is better?

• If 
$$W_i=\gamma e^{\beta G_i}$$
, then  $\frac{W_{i+1}}{W_i}=e^{\beta (G_{i+1}-G_i)}=e^{\beta}$  is fixed.

- Then  $\log(W_i) = \alpha + \beta G_i + \varepsilon_i$  (with  $G_i = i$  and  $\alpha = \log(\gamma)$ )
- Outcomes:

	а	$SE_a$	b	$SE_b$	$R^2$
Men	2.341	0.0065	-0.0038	0.0007	0.677
Women	2.452	0.0099	-0.0056	0.0011	0.673

• Again, women made most progress.

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### **TRAINING EXERCISE 1.5**

- Train yourself by making the training exercise (see the website).
- After making this exercise, check your answers by studying the webcast solution (also available on the website).

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# Forecast of winning times for 2008 and 2012

#### Test

Use the four models shown below to forecast winning times (in seconds) of men and women in the Olympic games of 2008 (with  $G_i = i = 16$ ) and 2012 (with  $G_i = i = 17$ ).

Men:  $W_i = 10.386 - 0.038G_i + e_i$   $\log(W_i) = 2.341 - 0.0038G_i + e_i$ Women:  $W_i = 11.606 - 0.063G_i + e_i$   $\log(W_i) = 2.452 - 0.0056G_i + e_i$ 

Note: 'log' denotes the natural logarithm.

#### Answer:

	Men		Wo	Women	
	2008	2012	2008	2012	
Actual time	9.69	9.63	10.78	10.75	
Linear trend	9.78	9.74	10.60	10.54	
Nonlinear trend	9.78	9.74	10.62	10.56	

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