

Teacher Answer Key — All multiple regressions now guaranteed in
regressions solved without matrices.

Simple Regression — Q1: Study Hours and Exam Grade

DATA:

Study Hours	Exam Grade
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2	55
---	----

4	60
---	----

6	72
---	----

8	80
---	----

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 5.000000$, $\bar{y} = 66.750000$

$S_{xx} = 20.000000$, $S_{xy} = 87.000000$

$\beta_1 = S_{xy}/S_{xx} = 4.350000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 45.000000$

Residuals: [1.3, -2.4, 0.9, 0.2]

$SSE = 8.300000$

$\sigma^2 = 4.150000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 6.225 & -1.0375 \end{bmatrix}$

$\begin{bmatrix} -1.0375 & 0.2075 \end{bmatrix}$

Simple Regression — Q2: Advertising and Sales

DATA:

Advertising (000)Sales(000)

2	25
4	35
6	45
8	55

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 5.000000$, $\bar{y} = 40.000000$

$S_{xx} = 20.000000$, $S_{xy} = 100.000000$

$\beta_1 = S_{xy}/S_{xx} = 5.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 15.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \end{bmatrix}$

$\begin{bmatrix} -0. & 0. \end{bmatrix}$

Simple Regression — Q3: Experience and Wage

DATA:

Experience (years) Wage (\$/hr)

1	8
3	10
5	13
7	15

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 4.000000$, $\bar{y} = 11.500000$

$S_{xx} = 20.000000$, $S_{xy} = 24.000000$

$\beta_1 = S_{xy}/S_{xx} = 1.200000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 6.700000$

Residuals: [0.1, -0.3, 0.3, -0.1]

$SSE = 0.200000$

$\sigma^2 = 0.100000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0.105 & -0.02 \end{bmatrix}$

$\begin{bmatrix} -0.02 & 0.005 \end{bmatrix}$

Simple Regression — Q4: Price and Quantity Demanded

DATA:

Price	Quantity
10	100
12	90
14	80
16	70

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x}=13.000000$, $\bar{y}=85.000000$

$S_{xx} = 20.000000$, $S_{xy} = -100.000000$

$\beta_1 = S_{xy}/S_{xx} = -5.000000$

$\beta_0 = \bar{y} - \beta_1\bar{x} = 150.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \\$

$-0. & 0. \end{bmatrix}$

Simple Regression — Q5: Age and Medical Expenses

DATA:

Age	Expenses (\$)
30	200
40	300
50	400
60	500

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x}=45.000000$, $\bar{y}=350.000000$

$S_{xx} = 500.000000$, $S_{xy} = 5000.000000$

$\beta_1 = S_{xy}/S_{xx} = 10.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = -100.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \\$

$-0. & 0. \end{bmatrix}$

Simple Regression — Q6: Hours Worked and Weekly Income

DATA:

Hours	Income (\$)
-------	-------------

20	250
----	-----

30	300
----	-----

40	350
----	-----

50	400
----	-----

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 35.000000$, $\bar{y} = 325.000000$

$S_{xx} = 500.000000$, $S_{xy} = 2500.000000$

$\beta_1 = S_{xy}/S_{xx} = 5.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 150.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \\$

$-0. & 0. \end{bmatrix}$

Simple Regression — Q7: Years of Schooling and Income

DATA:

Years of Schooling	Monthly Income (\$)
--------------------	---------------------

8	1200
10	1500
12	1800
14	2100

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 11.000000$, $\bar{y} = 1650.000000$

$S_{xx} = 20.000000$, $S_{xy} = 3000.000000$

$\beta_1 = S_{xy}/S_{xx} = 150.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 0.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \end{bmatrix}$

$\begin{bmatrix} -0. & 0. \end{bmatrix}$

Simple Regression — Q8: Coffee Price and Cups Sold

DATA:

	Price (\$)	Cups Sold
1	90	
2	80	
3	70	
4	60	

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 2.500000$, $\bar{y} = 75.000000$

$S_{xx} = 5.000000$, $S_{xy} = -50.000000$

$\beta_1 = S_{xy}/S_{xx} = -10.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 100.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \end{bmatrix}$

$\begin{bmatrix} -0. & 0. \end{bmatrix}$

Simple Regression — Q9: Temperature and Ice Cream Sales

DATA:

Temperature (°C) Sales (\$)

20 150

25 200

30 250

35 300

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 27.500000$, $\bar{y} = 225.000000$

$S_{xx} = 125.000000$, $S_{xy} = 1250.000000$

$\beta_1 = S_{xy}/S_{xx} = 10.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = -50.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \end{bmatrix}$

$\begin{bmatrix} -0. & 0. \end{bmatrix}$

Simple Regression — Q10: Years in Business and Profit

DATA:

Years Profit (000\$)

1	10
3	20
5	30
7	40

STEP-BY-STEP:

$n = 4$

Sums and means: $\bar{x} = 4.000000$, $\bar{y} = 25.000000$

$S_{xx} = 20.000000$, $S_{xy} = 100.000000$

$\beta_1 = S_{xy}/S_{xx} = 5.000000$

$\beta_0 = \bar{y} - \beta_1 \bar{x} = 5.000000$

Residuals: [0.0, 0.0, 0.0, 0.0]

$SSE = 0.000000$

$\sigma^2 = 0.000000$

Var-Cov matrix (β_0, β_1):

$\begin{bmatrix} 0. & -0. \end{bmatrix}$

$\begin{bmatrix} -0. & 0. \end{bmatrix}$

Multiple Regression — Q1: Wage, Education, and Experience

DATA:

Education Experience Wage

8.0	1.001680	9.0
9.0	1.999067	10.0
11.0	3.995834	13.0
13.0	5.999333	16.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[ 4.      41.      12.99591331]
 [ 41.     435.     147.95054033]
 [ 12.99591331 147.95054033  56.95831577]]
```

$(X'X)^{-1}$:

```
[[3643122.39734924 -520493.79757913  520760.4073713 ]
 [-520493.79757913  74363.09726484 -74401.21938417]
 [ 520760.4073713  -74401.21938417  74439.42891293]]
```

beta estimates (beta0, beta1, beta2):

```
[400.0556, -56.102847, 57.556119]
```

Residuals: [0.114386, -0.188503, 0.091043, -0.016925]

SSE = 0.057193

$\sigma^2 = 0.057193$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[208360.62318404 -29768.5337462  29783.7819252 ]
 [-29768.5337462  4253.03890401 -4255.2192174 ]
 [ 29783.7819252 -4255.2192174  4257.40452998]]
```

Multiple Regression — Q2: Sales, Advertising, and Price

DATA:

Advertising (000)PriceSales(000)

2.0	10.0	42.0
3.0	9.0	51.0
4.0	8.0	63.0
6.0	7.0	80.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[ 4. 15. 34.]  
 [ 15. 65. 121.]  
 [ 34. 121. 294.]]
```

$(X'X)^{-1}$:

```
[[744.83333333 -49.33333333 -65.83333333]  
 [-49.33333333  3.33333333  4.33333333]  
 [-65.83333333  4.33333333  5.83333333]]
```

beta estimates (beta0, beta1, beta2):

```
[62.5, 7.0, -3.5]
```

Residuals: [0.5, -1.0, 0.5, -0.0]

SSE = 1.500000

$\sigma^2 = 1.500000$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[1117.25 -74.  -98.75]  
 [-74.    5.    6.5 ]  
 [-98.75  6.5   8.75]]
```

Multiple Regression — Q3: House Price, Size, and Distance

DATA:

Size (m2)	Distance (km)	Price (000\$)
80.0	15.0	200.0
95.0	10.0	250.0
120.0	5.0	300.0
150.0	2.0	360.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[4.0000e+00 4.4500e+02 3.2000e+01]
 [4.4500e+02 5.2325e+04 3.0500e+03]
 [3.2000e+01 3.0500e+03 3.5400e+02]]
```

$(X'X)^{-1}$:

```
[[ 1.42843532e+02 -9.28427576e-01 -4.91324555e+00]
 [-9.28427576e-01  6.07281177e-03  3.16034082e-02]
 [-4.91324555e+00  3.16034082e-02  1.74670798e-01]]
```

beta estimates (beta0, beta1, beta2):

```
[162.587142, 1.37103, -4.701782]
```

Residuals: [-1.742835, 4.182804, -3.601859, 1.16189]

SSE = 34.856700

$\sigma^2 = 34.856700$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 4.97905418e+03 -3.23619217e+01 -1.71259527e+02]
 [-3.23619217e+01  2.11678180e-01  1.10159053e+00]
 [-1.71259527e+02  1.10159053e+00  6.08844764e+00]]
```

Multiple Regression — Q4: Profit, Employees, and Capital

DATA:

Employees	Capital (000)	Profit(000)
5.0	10.0	40.0
12.0	15.0	70.0
18.0	25.0	110.0
25.0	40.0	160.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[ 4. 60. 90.]  
 [ 60. 1118. 1680.]  
 [ 90. 1680. 2550.]]
```

$(X'X)^{-1}$:

```
[[ 1.28378378 -0.08108108  0.00810811]  
 [-0.08108108  0.09459459 -0.05945946]  
 [ 0.00810811 -0.05945946  0.03927928]]
```

beta estimates (beta0, beta1, beta2):

```
[4.594595, 2.972973, 2.036036]
```

Residuals: [0.18018, -0.810811, 0.990991, -0.36036]

SSE = 1.801802

$\sigma^2 = 1.801802$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 2.31312393 -0.14609204  0.0146092 ]  
 [-0.14609204  0.17044071 -0.10713416]  
 [ 0.0146092 -0.10713416  0.07077348]]
```

Multiple Regression — Q5: Crop Yield, Fertilizer, and Rainfall

DATA:

Fertilizer (kg)	Rainfall (mm)	Yield (tons)
20.0	50.0	12.0
45.0	65.0	18.0
70.0	75.0	24.0
95.0	90.0	30.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[4.0000e+00 2.3000e+02 2.8000e+02]
 [2.3000e+02 1.6350e+04 1.7725e+04]
 [2.8000e+02 1.7725e+04 2.0450e+04]]
```

$(X'X)^{-1}$:

```
[[ 3.2291e+02  4.1520e+00 -8.0200e+00]
 [ 4.1520e+00  5.4400e-02 -1.0400e-01]
 [-8.0200e+00 -1.0400e-01  2.0000e-01]]
```

beta estimates (beta0, beta1, beta2):

```
[7.2, 0.24, -0.0]
```

Residuals: [0.0, 0.0, 0.0, 0.0]

SSE = 0.000000

$\sigma^2 = 0.000000$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 1.56508957e-19  2.01240342e-21 -3.88715690e-21]
 [ 2.01240342e-21  2.63667501e-23 -5.04070222e-23]
 [-3.88715690e-21 -5.04070222e-23  9.69365811e-23]]
```


Multiple Regression — Q6: Car Price, Age, and Mileage

DATA:

Age (yrs)	Mileage (000 km)	Price (000\$)
1.0	10.0	50.0
2.0	22.0	46.0
3.0	35.0	42.0
5.0	55.0	30.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[4.000e+00 1.100e+01 1.220e+02]
 [1.100e+01 3.900e+01 4.340e+02]
 [1.220e+02 4.340e+02 4.834e+03]]
```

$(X'X)^{-1}$:

```
[[ 1.16438356 -1.54794521  0.10958904]
 [-1.54794521 30.49315068 -2.69863014]
 [ 0.10958904 -2.69863014  0.23972603]]
```

beta estimates (beta0, beta1, beta2):

```
[56.191781, -13.972603, 0.794521]
```

Residuals: [-0.164384, 0.273973, -0.082192, -0.027397]

SSE = 0.109589

$\sigma^2 = 0.109589$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 0.12760368 -0.16963783  0.01200976]
 [-0.16963783  3.34171514 -0.29574029]
 [ 0.01200976 -0.29574029  0.02627135]]
```

Multiple Regression — Q7: Productivity, Training, and Experience

DATA:

Training Hours	Experience	Output (units/hr)
5.0	1.0	11.0
12.0	4.0	18.0
18.0	6.0	24.0
25.0	10.0	36.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[ 4. 60. 21.]  
 [ 60. 1118. 411.]  
 [ 21. 411. 153.]]
```

$(X'X)^{-1}$:

```
[[ 5.15217391 -1.32608696  2.85507246]  
 [-1.32608696  0.41304348 -0.92753623]  
 [ 2.85507246 -0.92753623  2.10628019]]
```

beta estimates (beta0, beta1, beta2):

```
[8.753623, -0.376812, 3.647343]
```

Residuals: [0.483092, -0.821256, 0.144928, 0.193237]

SSE = 0.966184

$\sigma^2 = 0.966184$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 4.97794581 -1.28124344  2.75852412]  
 [-1.28124344  0.39907582 -0.89617027]  
 [ 2.75852412 -0.89617027  2.03505333]]
```

Multiple Regression — Q8: Demand, Income, and Price

DATA:

Income (000\$)	Price	Quantity
20.0	5.0	100.0
30.0	4.0	140.0
40.0	3.0	180.0
60.0	2.0	260.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[4.0e+00 1.5e+02 1.4e+01]
 [1.5e+02 6.5e+03 4.6e+02]
 [1.4e+01 4.6e+02 5.4e+01]]
```

$(X'X)^{-1}$:

```
[[ 2.32333333e+02 -2.76666667e+00 -3.66666667e+01]
 [-2.76666667e+00  3.33333333e-02  4.33333333e-01]
 [-3.66666667e+01  4.33333333e-01  5.83333333e+00]]
```

beta estimates (beta0, beta1, beta2):

```
[20.0, 4.0, 0.0]
```

Residuals: [-0.0, -0.0, -0.0, -0.0]

SSE = 0.000000

$\sigma^2 = 0.000000$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 3.58396592e-19 -4.26785038e-21 -5.65618725e-20]
 [-4.26785038e-21  5.14198841e-23  6.68458493e-22]
 [-5.65618725e-20  6.68458493e-22  8.99847972e-21]]
```

Multiple Regression — Q9: Energy Use, Temperature, and House Si

DATA:

Temperature (°C)	Size (m2)	Energy Use (kWh)
15.0	80.0	210.0
22.0	105.0	270.0
28.0	125.0	330.0
35.0	160.0	420.0

STEP-BY-STEP:

Design X'X matrix:

```
[[4.000e+00 1.000e+02 4.700e+02]
 [1.000e+02 2.718e+03 1.261e+04]
 [4.700e+02 1.261e+04 5.865e+04]]
```

$(X'X)^{-1}$:

```
[[14.13475177 2.18794326 -0.58368794]
 [ 2.18794326 0.4858156 -0.12198582]
 [-0.58368794 -0.12198582 0.03092199]]
```

beta estimates (beta0, beta1, beta2):

```
[-0.957447, 0.638298, 2.489362]
```

Residuals: [2.234043, -4.468085, 1.914894, 0.319149]

SSE = 28.723404

$\sigma^2 = 28.723404$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[405.99818923 62.84517881 -16.76550475]
 [ 62.84517881 13.95427795 -3.50384789]
 [-16.76550475 -3.50384789 0.8881847 ]]
```

Multiple Regression — Q10: Life Satisfaction, Income, and Leisure

DATA:

Income (000\$)	Leisure Hours	Life Satisfaction
20.0	10.0	5.0
35.0	15.0	6.0
50.0	25.0	8.0
70.0	30.0	10.0

STEP-BY-STEP:

Design $X'X$ matrix:

```
[[4.000e+00 1.750e+02 8.000e+01]
 [1.750e+02 9.025e+03 4.075e+03]
 [8.000e+01 4.075e+03 1.850e+03]]
```

$(X'X)^{-1}$:

```
[[ 1.95945946  0.04864865 -0.19189189]
 [ 0.04864865  0.02162162 -0.04972973]
 [-0.19189189 -0.04972973  0.11837838]]
```

beta estimates (beta0, beta1, beta2):

```
[2.608108, 0.07027, 0.078378]
```

Residuals: [0.202703, -0.243243, -0.081081, 0.121622]

SSE = 0.121622

$\sigma^2 = 0.121622$

Var-Cov matrix = $\sigma^2 * (X'X)^{-1}$:

```
[[ 0.23831264  0.00591673 -0.0233382 ]
 [ 0.00591673  0.00262966 -0.00604821]
 [-0.0233382 -0.00604821  0.01439737]]
```