



QS101: Introduction to Quantitative Methods in Social Science

Week 19: Multivariate Regression and Regression with Categorical Variables

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Your Regression Models I

Regression with Categorical Variables

Dichotomous Categorical Variables

Regression with a 1/2/3 Variable

Your Regression Models II

Your Regression Models I

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- ▶ Interpret the results:
 - ▶ What does the constant mean?
 - ▶ What does each slope coefficient indicate?
 - ▶ Are your results significant at the 95% level, and what does this mean?



Regression with Categorical Variables



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Dichotomous Categorical Variables



The Setup

- ▶ You can enter a dichotomous categorical variable just like you would with a continuous one

Source of this section: <http://www.ats.ucla.edu/stat/stata/webbooks/reg/chapter3/statareg3.htm>



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- ▶ If necessary, recode, for example: **recode c_sex 1=0 2=1**
- ▶ Run the regression: **regress c_fimngrs_dv c_sex**
- ▶ The interpretation of the output is straightforward

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Dichotomous Categorical Variables

The Output

```
. regress c_fimngrs_dv c_sex
```

Source	SS	df	MS			
Model	5.7436e+09	1	5.7436e+09	Number of obs =	49739	
Residual	1.4050e+11	49737	2824917.28	F(1, 49737) =	2033.18	
Total	1.4625e+11	49738	2940336.8	Prob > F =	0.0000	
				R-squared =	0.0393	
				Adj R-squared =	0.0393	
				Root MSE =	1680.7	

c_fimngrs_dv	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
c_sex	-682.0223	15.12554	-45.09	0.000	-711.6686	-652.3761
_cons	2743.874	24.50872	111.96	0.000	2695.837	2791.912

Figure: Regression on the Influence of Gender on Monthly Income



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- ▶ Now build the estimated regression equation
- ▶ Male: $2743.87 - 682.02 \times 0 = 2743.87$
- ▶ Female: $2743.87 - 682.02 \times 1 = 2061.85$
- ▶ The coefficient therefore tells you how much more or less the category coded as “1” would earn.



Regression with Categorical Variables

Regression with a 1/2/3 Variable

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- ▶ Captures 3 religious categories: Christian (1), Muslim (2), and Other (3) (source: variable **c_opr1g1**)



The Setup

- ▶ If we have a predictor with three (or more) categories, we need to transform these
- ▶ For example: new variable **c_rel**
- ▶ Captures 3 religious categories: Christian (1), Muslim (2), and Other (3) (source: variable **c_opr1g1**)
- ▶ We need to create dummy variables from **c_rel**:



Creating Dummy Variables

Old Variable	New Variables		
c_rel	c_rel1	c_rel2	c_rel3
1	1	0	0
1	1	0	0
1	1	0	0
2	0	1	0
2	0	1	0
2	0	1	0
3	0	0	1
3	0	0	1
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Generate the Dummies

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- ▶ The command is: `tabulate oldvar, gen(oldvar)`
- ▶ For example: `tabulate c_rel, gen(c_rel)`
- ▶ You can check the coding for the first ten cases by typing:
`list c_rel c_rel1 c_rel2 c_rel3 in 1/10, nolabel`



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- ▶ For example: **regress c_fimngrs_dv c_rel2 c_rel3**

Regression with a 1/2/3 Variable

The Output

```
. regress c_fimngrs_dv c_rel2 c_rel3
```

Source	SS	df	MS			
Model	14337589.8	2	7168794.9	Number of obs =	430	
Residual	518291115	427	1213796.52	F(2, 427) =	5.91	
Total	532628704	429	1241558.75	Prob > F =	0.0030	
				R-squared =	0.0269	
				Adj R-squared =	0.0224	
				Root MSE =	1101.7	

c_fimngrs_dv	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
c_rel2	-384.9522	121.9882	-3.16	0.002	-624.7243	-145.1801
c_rel3	-56.5929	160.4413	-0.35	0.724	-371.9459	258.7601
_cons	975.1469	97.76223	9.97	0.000	782.9918	1167.302

Figure: Regression on the Influence of Religion on Monthly Income



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- ▶ Here, **c_rell** is omitted, so **_cons** shows the mean for a Christian person



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- ▶ Here, **c_rell** is omitted, so **_cons** shows the mean for a Christian person
- ▶ The other coefficients tell you how much more, or less a Muslim or a person with the religion “other” earns, *relative* to a Christian person



Interpretation

- ▶ Here, **c_re11** is omitted, so **_cons** shows the mean for a Christian person
- ▶ The other coefficients tell you how much more, or less a Muslim or a person with the religion “other” earns, *relative* to a Christian person
- ▶ Last step, test that the differences between the three groups are significant, by typing: **test c_re12 c_re13**



Regression with a 1/2/3 Variable

```
. test c_rel2 c_rel3

( 1)  c_rel2 = 0
( 2)  c_rel3 = 0

          F( 2, 427) =    5.91
          Prob > F =    0.0030
```

Figure: Test for Significant Differences of Income between Religious Groups

The Shortcut: `xi`

- ▶ We can save ourselves the faffing with generating the dummies by using the `xi` command



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The Shortcut: **xi**

- ▶ We can save ourselves the faffing with generating the dummies by using the **xi** command
- ▶ For example: **xi: regress c_fimngrs_dv i.c_rel**
- ▶ STATA automatically leaves the first category (here: Christian) out
- ▶ If you want to omit a different category as your reference, you can tell STATA before running the regression: **char c_rel[omit] 3**

The Output

```
. xi: regress c_fimngrs_dv i.c_rel
i.c_rel      _Ic_rel_1-3      (naturally coded; _Ic_rel_1 omitted)
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_Ic_rel_2	-384.9522	121.9882	-3.16	0.002	-624.7243	-145.1801
_Ic_rel_3	-56.5929	160.4413	-0.35	0.724	-371.9459	258.7601
_cons	975.1469	97.76223	9.97	0.000	782.9918	1167.302

Figure: Regression on the Influence of Religion on Monthly Income



Regression with a 1/2/3 Variable

- ▶ The test command here is: **test _Ic_rel2 _Ic_rel3**

```
. test _Ic_rel_2 _Ic_rel_3
```

```
( 1)  _Ic_rel_2 = 0
```

```
( 2)  _Ic_rel_3 = 0
```

```
F( 2, 427) = 5.91
```

```
Prob > F = 0.0030
```

Your Regression Models II

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