

Introduction to Econometrics
Professor Sabuj Kumar Mandal
Department of Humanities and Social Sciences
Indian Institute of Technology, Madras
Lecture 28

Structural break analysis using Chow test Part - 1

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$$t = \frac{\hat{\beta}_1 + \hat{\beta}_2}{\sqrt{\text{Var}(\hat{\beta}_1) + \text{Var}(\hat{\beta}_2) + 2\text{Cov}(\hat{\beta}_1, \hat{\beta}_2)}}$$

$$\beta_1 + \beta_2 = 1$$

$$\Rightarrow \beta_2 = (1 - \beta_1)$$

$$\text{or } \beta_1 = (1 - \beta_2)$$

unrestricted model

$$\begin{aligned}
 - \ln Y_i &= \ln \beta_0 + \beta_1 \ln X_{1i} + \beta_2 \ln X_{2i} + U_i \\
 &= \ln \beta_0 + \beta_1 \ln X_{1i} + (1 - \beta_1) \ln X_{2i} + U_i \\
 &= \ln \beta_0 + \beta_1 (\ln X_{1i} - \ln X_{2i}) + \ln X_{2i} + U_i \\
 \Rightarrow (\ln Y_i - \ln X_{2i}) &= \ln \beta_0 + \beta_1 \ln \left(\frac{X_{1i}}{X_{2i}} \right) + U_i \\
 \Rightarrow \ln \left(\frac{Y_i}{X_{2i}} \right) &= A + \beta_1 \ln \left(\frac{X_{1i}}{X_{2i}} \right) + U_i \quad \text{--- Restricted model 1} \\
 \Rightarrow \ln \left(\frac{Y_i}{X_{1i}} \right) &= A + \beta_2 \ln \left(\frac{X_{2i}}{X_{1i}} \right) + U_i \quad \text{--- Restricted model 2}
 \end{aligned}$$

So, t was defined as $\hat{\beta}_1 + \hat{\beta}_2$ divided by variance of $\hat{\beta}_1$ plus variance of $\hat{\beta}_2$ plus 2 into covariance of $\hat{\beta}_1$ and $\hat{\beta}_2$, β_2 hat so, this we have a discuss a study but testing these linear restrictions this particular test you can also conduct that means, the test statistic can be alternatively formulated as using F statistic also that we have not discussed yesterday.

So, let me talk about the application of F statistic to test the same hypothesis of testing linear restriction, so that means are I will write our production function once again Y_i basically log of Y_i equals to log of β_0 plus β_1 log of X_{1i} plus β_2 log of X_{2i} plus U_i this is what the production function after taking log.

Now, in this particular production function, we will impose the restriction and what is our restriction $\beta_1 + \beta_2 = 1$. So, that means from there what I can write as $\beta_2 = 1 - \beta_1$ or $\beta_1 = 1 - \beta_2$ so you can either substitute the value of β_1 in terms of $1 - \beta_2$ or β_2 in terms of $1 - \beta_1$.

So, let me then, put the value in this way so, I will substitute β_2 this would become log of β_0 plus β_1 log of X_{1i} plus in place of β_2 I am putting $1 - \beta_1$ log of

X_{2i} plus u_i so, that would become \log of β_0 plus here you have $\beta_1 \log$ of X_{1i} so, here you have minus of $\beta_1 \log$ of X_{1i} so, that means, you can take β_1 common and this would become \log of X_{1i} minus \log of X_{2i} plus \log of X_{2i} plus u_i .

Now, this \log of X_{2i} you can take left hand side so, that will make \log of Y_i minus \log of X_{2i} equals to \log of β_0 plus $\beta_1 \log$ of X_{1i} divided by X_{2i} plus u_i and this would become \log of Y_i by X_{2i} equals 2, I can take this as a constant \log of β_0 let us say this is some constant A plus $\beta_1 \log$ of X_{1i} divided by X_{2i} plus u_i .

So, that means, this particular from this particular equation what I can say that output per unit of capital is actually a function of labour per of capital and this particular equation is called the restricted equation. Why this is restricted model?

Because, this model I have derived after imposing the restriction $\beta_1 + \beta_2 = 1$ and our unrestricted model is basically this one this is our unrestricted model so I have not done anything new I have simply imposed the linear restriction $\beta_1 + \beta_2$ in the model then ultimately, I have come up with this model which is the restricted version of this equation which basically says this is the output capital ratio which is a function of labour by capital.

Similarly, if you put the other restriction see here I have imposed, I have substituted the value of β_2 with β_1 similarly, you can replace value of β_1 with $1 - \beta_2$ and in that case you will get another version of restricted equation which would become \log of Y_i divided by X_{1i} would become $A + \beta_2 \log$ of X_{2i} divided by X_{1i} plus U_i here, this is another version of restricted model this is also restricted model instead of saying equation I will say this is the restricted model 1 this is the restricted model 2 so, both are restricted versions.

Now, for economist the restricted model 2 is more appealing and more used in the literature, where we assume that output level ratio output labour ratio is a function of labour capital ratio, capital labour ratio, how much capital per unit of labour is endowed with so, 1 unit of labour how much capital that particular labour is getting, that will determine a labour productivity. Because, this left-hand side output by labour which is called labour productivity, average productivity of the labour, average productivity of the labour is determined by how much capital is allocated per unit of labour.

So, equation 2 you can get both versions not a problem from econometric point of view, either you can substitute beta 2 for beta 1 or beta 1 for beta 2 what I am saying that, the restricted versions restricted model 2 is more appealing for the economist and more used in the literature compared to restricted version 1.

Now, what we will do from these 2, we will construct another test statistic to test the validity of this linear restriction so, what we are testing we are actually testing the validity of this linear restriction beta1 plus beta2 equals to 1 and the if you look at the way we are deriving, we are substituting that means, initially we have assumed the restriction is valid if the restriction is valid then, then I can substitute beta1 for beta2 or beta2 for beta1 then I can test I can get 2 restricted versions of the model 1 is restricted model 1 another restricted model 2 then, look at how I am constructing that test statistic.

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$$F = \frac{(RSS_R - RSS_{UR}) / m \text{ (= no. of linear restrictions)}}{(1 - RSS_R) / n - R \text{ (= no. of parameters to be estimated in the restricted model including intercept)}}$$

The T statistic is RSS and is defined in terms of RSS is not R square RSS is restricted minus RSS unrestricted divided by m and what is m please keep in mind m is number of linear restriction so I will write here m equals to number of linear restriction which is 1 in this particular context divided by 1 minus RSS R which is equals to n minus k where k is number of parameters to be estimated in the restricted model k equals to number of parameters to be estimated in a restricted model.

Now, first question if you look at the earlier F that means, when we are testing the equality between 2 regression coefficients, we are using F statistic but, that if was defined in terms of

R square, R square new and R square old then, why we are using, why we are not using R square to define the same test statistic here see, we are not defining R square in this module.

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The slide content is as follows:

$$t = \frac{\hat{\beta}_1 + \hat{\beta}_2}{\sqrt{\text{Var}(\hat{\beta}_1) + \text{Var}(\hat{\beta}_2) + 2\text{Cov}(\hat{\beta}_1, \hat{\beta}_2)}}$$

$\beta_1 + \beta_2 = 1$ ✓
 $\Rightarrow \beta_2 = (1 - \beta_1)$
 or $\beta_1 = (1 - \beta_2)$

unrestricted model

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

$$= \ln \beta_0 + \beta_1 \ln X_{1i} + (1 - \beta_1) \ln X_{2i} + u_i$$

$$= \ln \beta_0 + \beta_1 (\ln X_{1i} - \ln X_{2i}) + \ln X_{2i} + u_i$$

$$\Rightarrow (\ln Y_i - \ln X_{2i}) = \ln \beta_0 + \beta_1 \ln \left(\frac{X_{1i}}{X_{2i}} \right) + u_i$$

$$\Rightarrow \ln \left(\frac{Y_i}{X_{2i}} \right) = A + \beta_1 \ln \left(\frac{X_{1i}}{X_{2i}} \right) + u_i \quad \text{--- Restricted model 1}$$

$$\Rightarrow \ln \left(\frac{Y_i}{X_{1i}} \right) = A + \beta_2 \ln \left(\frac{X_{2i}}{X_{1i}} \right) + u_i \quad \text{--- Restricted model 2}$$

Because, if you look at what is our 2 models, if you compare the restricted and unrestricted model, see an unrestricted model, what is your dependent variable? Your dependent variable is log of Y_i but, in the restricted model, what is your dependent variable?

Log of Y_i by X_{1i} so, that means, that dependent variable of the 2 models are not same and when the dependent variable of the 2 models are not same, please keep in mind that R square is not comparable because, what is R square? R square basically the proportion of the total variation in the dependent variable that is explained by your explanatory variables. Since, the dependent variable itself is different in 2 different model then, I cannot say that, these 2 R square are same, that is the reason the R square, what we get from the unrestricted model is different from R square, what we are getting from the restricted model that is the reason these 2 R square are not comparable.

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The image shows a presentation slide with a handwritten formula for the F-statistic. The formula is:

$$F = \frac{(RSS_R - RSS_{UR}) / m \text{ (no. of linear restrictions)}}{(1 - RSS_R) / (n - k) \text{ (no. of parameters to be estimated in the restricted model including intercept)}}$$

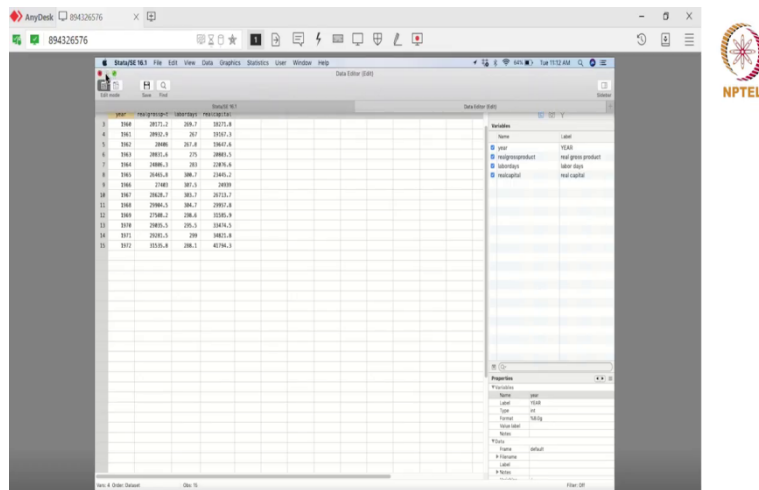
The slide also features a Windows Journal interface at the top, an NPTEL logo on the right, and a small video inset of a man in a red plaid shirt at the bottom right.

So, alternatively we are defining our test statistic F in terms of RSS, RSS_R that means RSS from the restricted model RSS_{UR} from the unrestricted model $1 - RSS_R$ and k equals to number of parameters to be estimated in the restricted model including intercept that also you should write, including intercept including intercept.

Now, here if you forget whether the numerator should be RSS_R minus RSS_{UR} or RSS_{UR} minus RSS_R you just think out of these 2 RSS which is more obviously, when you put restriction in the model you have less number of extramarital variable that is the reason RSS should be higher quite simple, quite understandable in a restricted version, you have less number of explanatory variable that is why, when the number of explanatory variable is less, obviously, the residual part would be more.

So, that is why RSS are is always greater than or at least equals to RSS_{UR} it should not be less than RSS_{UR} that is the reason if you remember that point in mind then, you will never get confused between whether the numerators should be RSS_R minus RSS_{UR} or RSS_{UR} minus RSS_R . So, you can put, you can estimate the 2 models and then, you can collect RSS_R RSS_{UR} and then, you can put this value and you can always get the value of F statistic.

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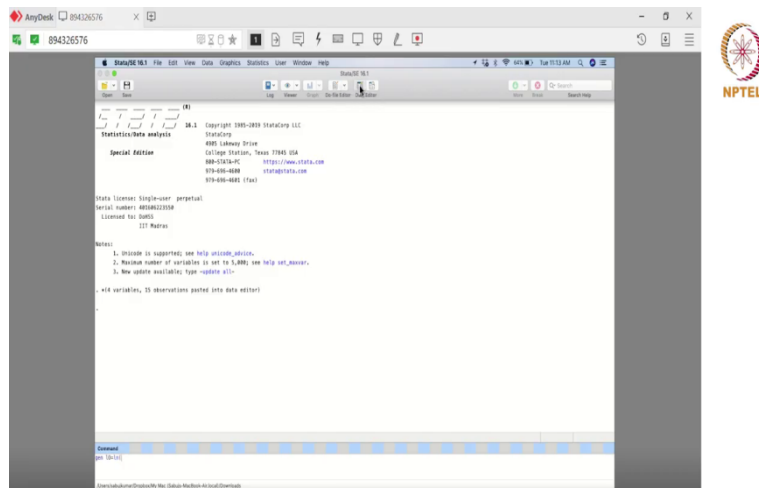
So, now what I will do, I will go back to again, the data set so, I lost for you how to estimate this model so, for that, I am just exiting from this child mortality data opening a new data set, which is given here, this capital labour so, this is our data this is a time series data on real cross product and then I mean in putting this into data.

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So, I will put that into data editor here, so this is how so, here I will now, what you have to do, you have to estimate the model now, see our variable if you look at our variable is in nominal term that means you have variables are in level you have output in level form, you have capital and labour both your level form and how we have defined a variable? So, we have defined the variable as this we have defined as, see look at real gross output then, labour days gross output then, this is real gross product real this then, labour days and real capital.

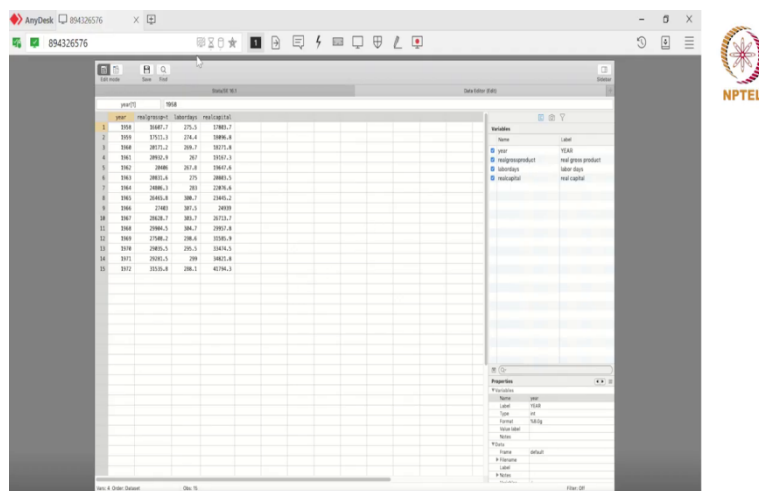
So, first thing, what we have to do, if we want to estimate this model, we have to convert all these variables into log form right and how to do that, how to do that I will just give a, I will just show you, how to convert the variable in level form in log form using data command. So, that is also something to learn so, I will now show you that.

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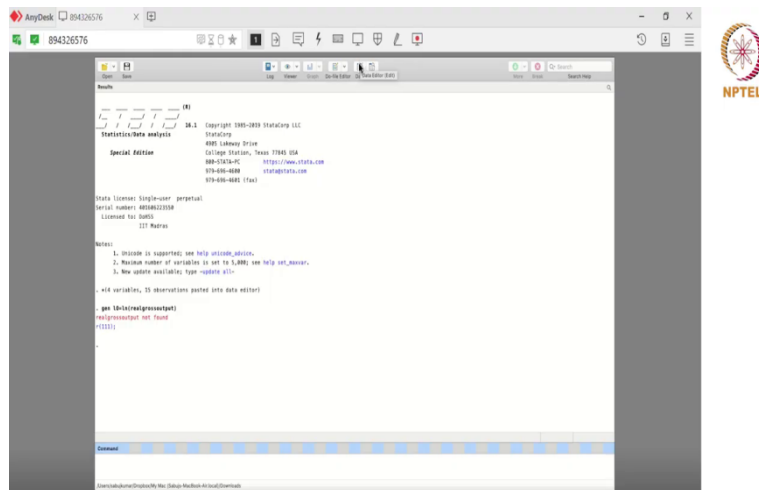
So, here the command would be please keep, in mind command would be gen, I am giving a name for the variable that I am going to generate let us say gen L and then I am putting output. So, this is become, this how we, I am defining the variable log of in the model then, you have to go back and see how you have defined the variable, how you have defined the variable, this you have to see how you have defined the variable.

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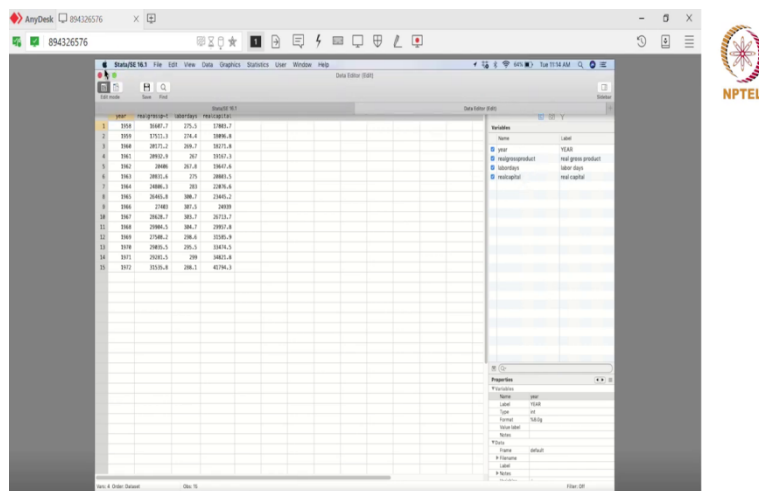
So, there you have to just go to data editor and just you see this is the real gross output, this is how I have defined real gross output so, when you are converting this variable into log form, you have to just put this variable name after that log function then, it will work.

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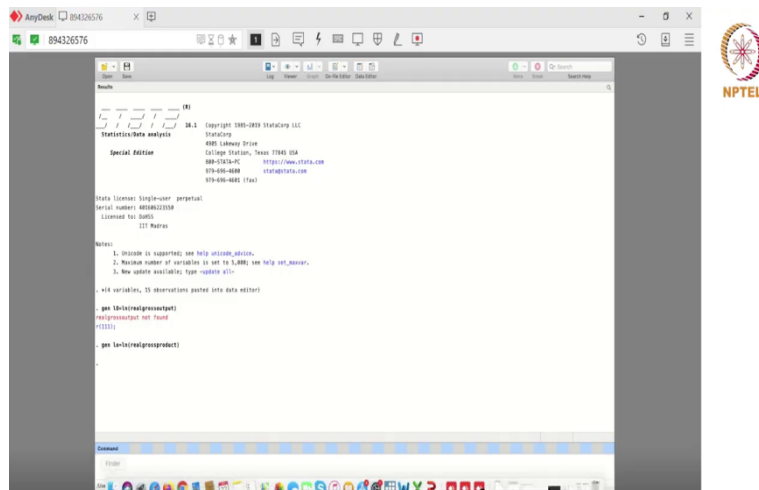
So, I will show you how to convert 1 variable so, log of real then, cross out output then bracket close and if you put enter so that means I have made some mistake there in defining the variable let me see once again how I have defined the variable. So, I have said real cross output how it is defined there.

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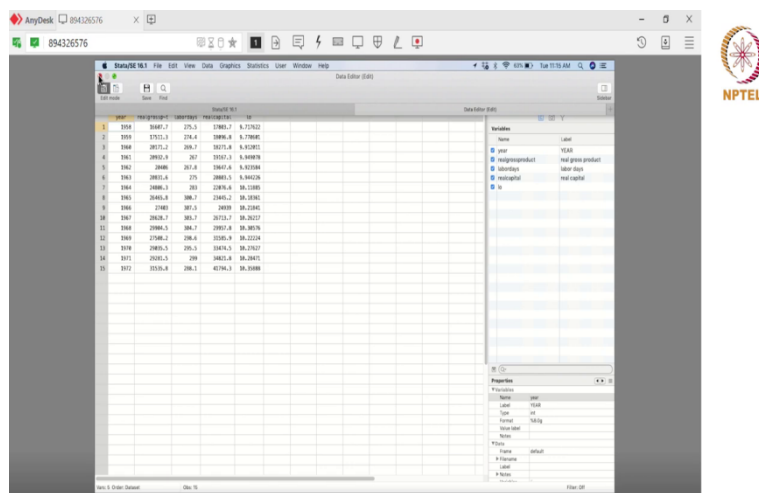
Real gross product, see you have to exactly type this variable name, if you commit mistake there then, it will not come real gross product.

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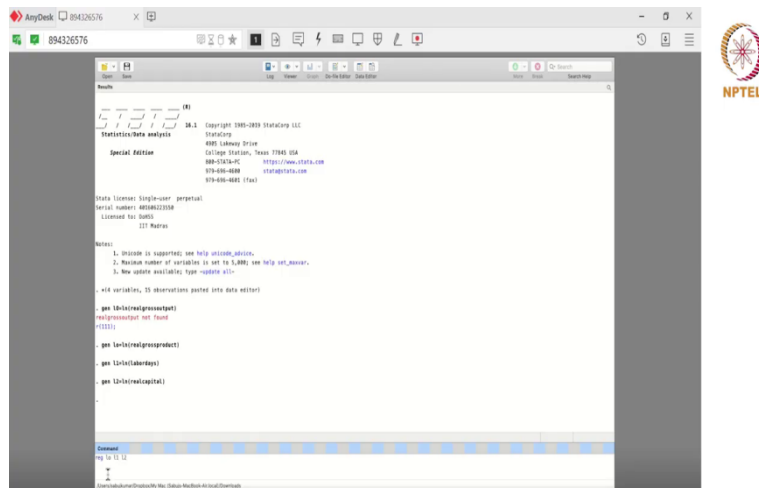
So, instead of output what I will say this is I can this is $\ln L_0$ equals to \ln real gross product then, if you put enter it will work. So, that means now, I have converted the level variable of output into log form and the variable is defined as L_0 .

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Similarly, I can look at what is the variable name for other one which is labour days and real capital, see here L_0 is there so, that means their variable is converted into log so, this is labour days and real capital so, same way you have to convert these two variables also labour days and real capital.

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Stata 16.1 Copyright 1989-2019 StataCorp LLC
Statistica/Data analysis 32-bit Win64
Special Edition
6000 Lakeside Drive
College Station, Texas 77843 USA
800-537-5254
817-439-4400
817-439-4402 (fax)
statacorp.com

Stata license: single-user perpetual
Serial number: 461648123306
Licensed to: 50453
227 Madison

Notes:
1. Windows is supported; see help windows_admin.
2. Maximum number of variables is set to 5,000; see help set_maxvar.
3. See update available; type update user.

*** variables, 33 observations posted into data editor ***

gen ln0=ln(realgrossprod)
realgrossprod not found
(1)

gen ln1=ln(radprod)

gen ln2=ln(labordays)

gen ln3=ln(capital)
```

So, I will put another gen command let us say that is L1 equals to Ln labour days and this variable is now converted into log and then, the third on gen L2 defined as Ln in the bracket real capital so, all the theory variables are now converted into log. So, my dependent variable which was real gross product that is also now converted into long form and defined as L0 then.

Labour is measured by labour days which is also now converted into log and defined as L1 and capital variable is also now converted into log of capital and that is defined as L2. So, now all your variables are converted into log and you can easily run the regression which is reg L0 so, L0 then, this is L0 I have given equals to now, equals 2 then, L1 and then L2 this is how I have now converted the linear model into a log linear 1 and you can put enter.

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Stata Results

```
Source: SS | df | MS | Number of obs = 33 | F(2, 31) = 48.87 | Model | 3.08918827 | 2 | 1.54459413 | Prob > F | 0.0000 | Residual | .06710173 | 31 | .00216509 | R-squared | 0.8099 | Total | 3.09589000 | 33 | .09381182 | Adj R-squared | 0.8795 | Root MSE | .0465582
```

Source	SS	df	MS	Number of obs	F(2, 31)	Prob > F
Model	3.08918827	2	1.54459413		48.87	0.0000
Residual	.06710173	31	.00216509			0.8099
Total	3.09589000	33	.09381182			0.8795

	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
1	1.448797	.000018	2.78	0.007	.5220493 2.874904
2	.000018	.000001	4.00	0.000	.000000 0.000036
3	2.780000	0.000000	4.00	0.000	2.015249 3.544751
_cons	0.837000	0.000000	4.00	0.000	0.000000 1.674000

So, this is your unrestricted model, this is your unrestricted model and from here, what you have to do you have to collect your RSS look at, what is your RSS? Residual sum of square which is 0.0671 so, this you have to collect which is RSS. this is RSS UR because, I have not yet put any restriction in the model that is why it is called RSS unrestricted. what is the value? 0.0671 this would become your RSS UR then, you have to estimate the RSS restricted 1 and how will you do that?

Again, you have to convert your dependent variable into labour output ratio in dependent variable as capital output ratio and how will you do that? simple, again using the gen command. So, if you use gen command, then you have to simply put 1 name let us say gen L output that would be defined as output by labour.

Similarly, you can put a name for labour capital ratio, capital labour ratio and then, that would be defined as capital divided by labour and once you do that, you can estimate the model of unrestricted one and then, restricted one and then you have to collect the RSS from that restricted version. So, we will discuss about the remaining portion of this estimation in tomorrow's class, we will estimate the restricted model in tomorrow's class. Thank you.