

### **Assignment 3** **Solution Guideline**

From the data set `assign3.dta`:

The study of production function assumes the model follows CES production function:

$$y = \gamma \left[ \delta K^{-\rho} + (1-\delta)L^{-\rho} \right]^{-\frac{\nu}{\rho}} + \varepsilon \quad (1)$$

where:

$y$  = Output  
 $K$  = Capital Input  
 $L$  = Labor Input  
 $\gamma$  = Efficiency Parameter  
 $\delta$  = Distribution Parameter  
 $\nu$  = Parameter  
 $\rho$  = Substitution Parameter  
 $\varepsilon$  = Disturbance Term

Elasticity of Substitution can be computed from:  $\sigma = \frac{1}{1-\rho}$

The model can then be transformed as:

$$\ln y = \ln \gamma - \frac{\nu}{\rho} \ln \left[ \delta K^{-\rho} + (1-\delta)L^{-\rho} \right] + \varepsilon \quad (2)$$

- a. Estimate the model (1) using NLS estimation method using initial values of  $\gamma=4$ ,  $\delta=0$ ,  $\rho=-1$ ,  $\nu=1$ . Determine the estimated value of efficiency parameter ( $\gamma$ ), distribution parameter ( $\delta$ ), parameter ( $\nu$ ), and substitution parameter ( $\rho$ ), and elasticity of substitution ( $\sigma$ ). Perform F-test to test whether  $\delta=0$ ,  $\rho=0$ , and  $\nu=0$ .

```
. nl (y = {gamma}*(((delta)*k^(-{rho}))+ (1-{delta})*l^(-{rho})))^(-({nu}/{rho})),
init(gamma 4 delta 0 rho -1 nu 1)
(obs = 800)
```

```
Iteration 0:  residual SS = 2.35e+20
```

```
...
```

```
Iteration 357:  residual SS = 9.27e+18
```

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 2.363e+20 | 4   | 5.9080e+19 | Number of obs = | 800      |
| Residual | 9.271e+18 | 796 | 1.1647e+16 | R-squared =     | 0.9622   |
|          |           |     |            | Adj R-squared = | 0.9621   |
|          |           |     |            | Root MSE =      | 1.08e+08 |
| Total    | 2.456e+20 | 800 | 3.0699e+17 | Res. dev. =     | 31861.36 |

| y      | Coef.    | Std. Err. | t     | P> t  | [95% Conf. Interval] |           |
|--------|----------|-----------|-------|-------|----------------------|-----------|
| /gamma | 2.89e-17 | 6.45e-17  | 0.45  | 0.654 | -9.77e-17            | 1.55e-16  |
| /delta | .801761  | .0319332  | 25.11 | 0.000 | .7390776             | .8644443  |
| /rho   | -1.88296 | .2889716  | -6.52 | 0.000 | -2.450197            | -1.315724 |
| /nu    | 3.39589  | .1261607  | 26.92 | 0.000 | 3.148243             | 3.643537  |

```

. est store nls1

. sca sigma=1/(1-(_b[/rho]))

. sca list sigma
      sigma = .34686566

. test (_b[/nu]=0) (_b[/rho]=0) (_b[/delta]=0)

( 1)  [nu]_cons = 0
( 2)  [rho]_cons = 0
( 3)  [delta]_cons = 0

      F( 3, 796) = 7383.35
      Prob > F = 0.0000

```

According to the above estimated results, estimated value of  $\gamma=2.89e-17$ ,  $\delta=0.8018$ ,  $\rho=-1.8830$ ,  $\nu=3.3959$ . F-test whether  $\delta=0$ ,  $\rho=0$ , and  $\nu=0$  with  $p\text{-value}<0.05$ , the null hypothesis is rejected.

- b. Estimate the model (2) using NLS estimation method initial values of  $\ln\gamma=4$ ,  $\delta=0$ ,  $\rho=-1$ ,  $\nu=1$ . Determine the estimated value of efficiency parameter ( $\gamma$ ), distribution parameter ( $\delta$ ), parameter ( $\nu$ ), and substitution parameter ( $\rho$ ), and elasticity of substitution ( $\sigma$ ). Perform F-test to test whether  $\delta=0$ ,  $\rho=0$ , and  $\nu=0$ .

```

. nl (lny = {lngamma}-{nu}/{rho})*ln({delta}*k^{-(rho)}+(1-{delta})*1^{-(rho)}), init(lngamma 4 delta 0 rho -1 nu 1)
(obs = 800)

```

Iteration 0: residual SS = 1143.768

...

Iteration 16: residual SS = 819.9925

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 976.20485 | 3   | 325.401616 | Number of obs = | 800      |
| Residual | 819.99246 | 796 | 1.03014129 | R-squared =     | 0.5435   |
|          |           |     |            | Adj R-squared = | 0.5418   |
|          |           |     |            | Root MSE =      | 1.014959 |
| Total    | 1796.1973 | 799 | 2.24805671 | Res. dev. =     | 2290.048 |

|          | lny | Coef.     | Std. Err. | t     | P> t  | [95% Conf. Interval] |
|----------|-----|-----------|-----------|-------|-------|----------------------|
| /lngamma |     | 3.798801  | .4234183  | 8.97  | 0.000 | 2.967652 4.629949    |
| /nu      |     | .9727292  | .0317774  | 30.61 | 0.000 | .9103518 1.035107    |
| /rho     |     | -.8079827 | .2186238  | -3.70 | 0.000 | -1.23713 -.3788354   |
| /delta   |     | .2351025  | .0328464  | 7.16  | 0.000 | .1706266 .2995784    |

Parameter lngamma taken as constant term in model & ANOVA table

```

. est store lognls1

. sca sigma=1/(1-(_b[/rho]))

. sca list sigma
      sigma = .55310264

. test (_b[/nu]=0) (_b[/rho]=0) (_b[/delta]=0)

( 1)  [nu]_cons = 0
( 2)  [rho]_cons = 0
( 3)  [delta]_cons = 0

```

```
F( 3, 796) = 366.55
Prob > F = 0.0000
```

According to the above estimated results, estimated value of  $\ln\gamma=3.7988$ ,  $\delta=0.2351$ ,  $\rho=-0.8080$ ,  $\nu=0.9727$ . F-test whether  $\delta=0$ ,  $\rho=0$ , and  $\nu=0$  with p-value<0.05, the null hypothesis is rejected.

- c. From (a), if we change initial values to be  $\gamma=55$ ,  $\delta=0$ ,  $\rho=-1$ ,  $\nu=1$ , what will happen to the estimated result? Interpret the estimated result and why do we get this kind of result? (Make comparison between previous result and the new result)

```
. nl (y = {gamma}*(({delta}*k^(-{rho}))+ (1-{delta})*1^(-{rho})))^(-({nu}/{rho})),
init(gamma 55 delta 0 rho -1 nu 1)
(obs = 800)
```

```
Iteration 0: residual SS = 1.65e+20
```

```
...
```

```
Iteration 19: residual SS = 1.35e+20
```

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 1.105e+20 | 4   | 2.7613e+19 | Number of obs = | 800      |
| Residual | 1.351e+20 | 796 | 1.6977e+17 | R-squared =     | 0.4497   |
| Total    | 2.456e+20 | 800 | 3.0699e+17 | Adj R-squared = | 0.4470   |
|          |           |     |            | Root MSE =      | 4.12e+08 |
|          |           |     |            | Res. dev. =     | 34004.87 |

| y      | Coef.     | Std. Err. | t     | P> t  | [95% Conf. Interval] |
|--------|-----------|-----------|-------|-------|----------------------|
| /gamma | 15.20637  | 9.357021  | 1.63  | 0.105 | -3.160981 33.57372   |
| /delta | .0547786  | 2.018277  | 0.03  | 0.978 | -3.906995 4.016552   |
| /rho   | -38.85704 | 533.1722  | -0.07 | 0.942 | -1085.447 1007.733   |
| /nu    | 1.063633  | .0348958  | 30.48 | 0.000 | .9951345 1.132132    |

```
. est store nls2
```

```
. est table nls1 nls2, star(.1 .05 .01) stat(N rss r2 r2_a)
```

| Variable   | nls1          | nls2         |
|------------|---------------|--------------|
| gamma      |               |              |
| _cons      | 2.889e-17     | 15.206371    |
| delta      |               |              |
| _cons      | .80176096***  | .05477862    |
| rho        |               |              |
| _cons      | -1.8829605*** | -38.857043   |
| nu         |               |              |
| _cons      | 3.3958902***  | 1.0636331*** |
| Statistics |               |              |
| N          | 800           | 800          |
| rss        | 9.271e+18     | 1.351e+20    |
| r2         | .96224959     | .44974701    |
| r2_a       | .96205989     | .44698192    |

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

According to the above estimated results, it indicated that using different sets of initial values can give the different estimated results.

- d. From (a), if we change convergence value from default of 0.00001 or (1e-5) to (i) 0.1 or (1e-1) and (ii) (1e-15) with maximum iteration of 100, what will happen to the estimated result? Interpret the estimated result and why do we get this kind of result? (Make comparison between previous result and the new result)

(i) Convergence value of 0.1 or (1e-1)

```
. nl (y = {gamma}*(((delta)*k^(-{rho}))+ (1-{delta})*1^(-{rho})))^(-
({nu}/{rho}))), init(gamma 4 delta 0 rho -1 nu 1) eps(1e-1)
(obs = 800)
```

Iteration 0: residual SS = 2.35e+20

Iteration 1: residual SS = 2.35e+20

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 1.043e+19 | 4   | 2.6070e+18 | Number of obs = | 800      |
| Residual | 2.352e+20 | 796 | 2.9543e+17 | R-squared =     | 0.0425   |
| Total    | 2.456e+20 | 800 | 3.0699e+17 | Adj R-squared = | 0.0376   |
|          |           |     |            | Root MSE =      | 5.44e+08 |
|          |           |     |            | Res. dev. =     | 34448.06 |

| y      | Coef.    | Std. Err. | t     | P> t  | [95% Conf. Interval] |          |
|--------|----------|-----------|-------|-------|----------------------|----------|
| /gamma | 4.000008 | 15.18432  | 0.26  | 0.792 | -25.80603            | 33.80605 |
| /delta | 1.29e-07 | .0001603  | 0.00  | 0.999 | -.0003145            | .0003148 |
| /rho   | -29.0199 | 2406.782  | -0.01 | 0.990 | -4753.41             | 4695.371 |
| /nu    | 1        | .2148918  | 4.65  | 0.000 | .5781783             | 1.421822 |

```
. est store nls3
```

(ii) Convergence value of 1e-15

```
. nl (y = {gamma}*(((delta)*k^(-{rho}))+ (1-{delta})*1^(-{rho})))^(-
({nu}/{rho}))), init(gamma 4 delta 0 rho -1 nu 1) eps(1e-15) iter(100)
(obs = 800)
```

Iteration 0: residual SS = 2.35e+20

...

Iteration 99: residual SS = 2.35e+20

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 1.044e+19 | 4   | 2.6109e+18 | Number of obs = | 800      |
| Residual | 2.351e+20 | 796 | 2.9541e+17 | R-squared =     | 0.0425   |
| Total    | 2.456e+20 | 800 | 3.0699e+17 | Adj R-squared = | 0.0377   |
|          |           |     |            | Root MSE =      | 5.44e+08 |
|          |           |     |            | Res. dev. =     | 34448.01 |

| y      | Coef.    | Std. Err. | t     | P> t  | [95% Conf. Interval] |          |
|--------|----------|-----------|-------|-------|----------------------|----------|
| /gamma | 4.002508 | 14.7236   | 0.27  | 0.786 | -24.89917            | 32.90419 |
| /delta | .0000247 | .007176   | 0.00  | 0.997 | -.0140615            | .0141109 |
| /rho   | -19.1599 | 594.6246  | -0.03 | 0.974 | -1186.378            | 1148.058 |
| /nu    | .9999954 | .2082142  | 4.80  | 0.000 | .5912816             | 1.408709 |

convergence not achieved

```
r(430);
```

```
. est store nls4
```

```
. est table nls1 nls3 nls4, star(.1 .05 .01) stat(N rss r2 r2_a)
```

| Variable   | nls1          | nls3       | nls4         |
|------------|---------------|------------|--------------|
| gamma      |               |            |              |
| _cons      | 2.889e-17     | 4.0000078  | 4.0025082    |
| delta      |               |            |              |
| _cons      | .80176096***  | 1.286e-07  | .00002472    |
| rho        |               |            |              |
| _cons      | -1.8829605*** | -29.019904 | -19.1599     |
| nu         |               |            |              |
| _cons      | 3.3958902***  | 1***       | .99999535*** |
| Statistics |               |            |              |
| N          | 800           | 800        | 800          |
| rss        | 9.271e+18     | 2.352e+20  | 2.351e+20    |
| r2         | .96224959     | .04246041  | .04252446    |
| r2_a       | .96205989     | .03764866  | .03771302    |

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

According to the above estimated results, it indicated that using different convergence values can give the different estimated results.

- e. From (b), if we change initial values to be  $\ln\gamma=55$ ,  $\delta=0$ ,  $\rho=-1$ ,  $\nu=1$ , what will happen to the estimated result? Interpret the estimated result and why do we get this kind of result? (Make comparison between previous result and the new result)

```
. nl (lny = {lngamma}-{nu}/{rho})*ln({delta}*k^{(-{rho})}+(1-{delta}))*1^{(-{rho}})), init(lngamma 55 delta 0 rho -1 nu 1)
(obs = 800)
```

```
Iteration 0: residual SS = 2124801
```

```
...
```

```
Iteration 22: residual SS = 819.9925
```

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 976.20485 | 3   | 325.401616 | Number of obs = | 800      |
| Residual | 819.99246 | 796 | 1.03014129 | R-squared =     | 0.5435   |
|          |           |     |            | Adj R-squared = | 0.5418   |
|          |           |     |            | Root MSE =      | 1.014959 |
| Total    | 1796.1973 | 799 | 2.24805671 | Res. dev. =     | 2290.048 |

| lny      | Coef.     | Std. Err. | t     | P> t  | [95% Conf. Interval] |
|----------|-----------|-----------|-------|-------|----------------------|
| /lngamma | 3.7988    | .4234183  | 8.97  | 0.000 | 2.967652 4.629949    |
| /nu      | .9727292  | .0317774  | 30.61 | 0.000 | .9103518 1.035107    |
| /rho     | -.8079832 | .2186233  | -3.70 | 0.000 | -1.237129 -.3788369  |
| /delta   | .2351025  | .0328464  | 7.16  | 0.000 | .1706267 .2995783    |

Parameter lngamma taken as constant term in model & ANOVA table

```
. est store lognls2
```

```
. est table lognls1 lognls2, star(.1 .05 .01) stat(N rss r2 r2_a)
```

| Variable   | lognls1       | lognls2       |
|------------|---------------|---------------|
| lngamma    |               |               |
| _cons      | 3.7988005***  | 3.7988004***  |
| nu         |               |               |
| _cons      | .97272923***  | .97272923***  |
| rho        |               |               |
| _cons      | -.80798268*** | -.80798318*** |
| delta      |               |               |
| _cons      | .23510249***  | .23510246***  |
| Statistics |               |               |
| N          | 800           | 800           |
| rss        | 819.99246     | 819.99246     |
| r2         | .54348419     | .54348419     |
| r2_a       | .54176366     | .54176366     |

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

*According to the above estimated results, it indicated that using log-form can lead to more robust estimated results.*

- f. From (b), if we change convergence value from default of 0.00001 or (1e-5) to (i) 0.1 or (1e-1) and (ii) (1e-15) with maximum iteration of 100, what will happen to the estimated result? Interpret the estimated result and why do we get this kind of result? (Make comparison between previous result and the new result)

(i) Convergence value of 0.1 or (1e-1)

```
. nl (lny = {lngamma}-{nu}/{rho})*ln({delta}*k^{-(rho)}+(1-{delta})*1^{-(rho)}), init(lngamma 4 delta 0 rho -1 nu 1) eps(1e-1) iter(100)
(obs = 800)
```

```
Iteration 0: residual SS = 1143.768
```

```
...
```

```
Iteration 10: residual SS = 819.993
```

| Source   | SS        | df  | MS         | Number of obs = | 800      |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 976.2043  | 3   | 325.401435 | R-squared =     | 0.5435   |
| Residual | 819.99301 | 796 | 1.03014197 | Adj R-squared = | 0.5418   |
| Total    | 1796.1973 | 799 | 2.24805671 | Root MSE =      | 1.014959 |
|          |           |     |            | Res. dev. =     | 2290.049 |

| lny      | Coef.     | Std. Err. | t     | P> t  | [95% Conf. Interval] |
|----------|-----------|-----------|-------|-------|----------------------|
| /lngamma | 3.799766  | .423419   | 8.97  | 0.000 | 2.968616 4.630915    |
| /nu      | .9727009  | .0317765  | 30.61 | 0.000 | .9103252 1.035077    |
| /rho     | -.8036163 | .2223873  | -3.61 | 0.000 | -1.240151 -.3670814  |
| /delta   | .2354804  | .0332066  | 7.09  | 0.000 | .1702977 .3006632    |

Parameter nu taken as constant term in model & ANOVA table

```
. est store lognls3
```

## (ii) Convergence value of 1e-15

```
. nl (lny = {lngamma}-{nu}/{rho})*ln({delta}*k^{-(rho)}+(1-{delta})*1^{-(rho)}), init(lngamma 4 delta 0 rho -1 nu 1) eps(1e-15) iter(100)
(obs = 800)
```

```
Iteration 0: residual SS = 1143.768
```

```
...
```

```
Iteration 23: residual SS = 819.9925
```

| Source   | SS        | df  | MS         |                 |          |
|----------|-----------|-----|------------|-----------------|----------|
| Model    | 222930.73 | 4   | 55732.6813 | Number of obs = | 800      |
| Residual | 819.99246 | 796 | 1.03014129 | R-squared =     | 0.9963   |
|          |           |     |            | Adj R-squared = | 0.9963   |
|          |           |     |            | Root MSE =      | 1.014959 |
| Total    | 223750.72 | 800 | 279.688397 | Res. dev. =     | 2290.048 |

| lny      | Coef.    | Std. Err. | t     | P> t  | [95% Conf. Interval] |           |
|----------|----------|-----------|-------|-------|----------------------|-----------|
| /lngamma | 3.7988   | .4234183  | 8.97  | 0.000 | 2.967652             | 4.629949  |
| /nu      | .9727292 | .0317774  | 30.61 | 0.000 | .9103518             | 1.035107  |
| /rho     | -.807984 | .2186225  | -3.70 | 0.000 | -1.237129            | -.3788392 |
| /delta   | .2351024 | .0328463  | 7.16  | 0.000 | .1706267             | .2995781  |

```
. est store lognls4
```

```
. est table lognls1 lognls3 lognls4, star(.1 .05 .01) stat(N rss r2 r2_a)
```

| Variable   | lognls1       | lognls3       | lognls4       |
|------------|---------------|---------------|---------------|
| lngamma    |               |               |               |
| _cons      | 3.7988005***  | 3.7997656***  | 3.7988003***  |
| nu         |               |               |               |
| _cons      | .97272923***  | .97270091***  | .97272924***  |
| rho        |               |               |               |
| _cons      | -.80798268*** | -.80361634*** | -.80798395*** |
| delta      |               |               |               |
| _cons      | .23510249***  | .23548043***  | .2351024***   |
| Statistics |               |               |               |
| N          | 800           | 800           | 800           |
| rss        | 819.99246     | 819.99301     | 819.99246     |
| r2         | .54348419     | .54348389     | .99633524     |
| r2_a       | .54176366     | .54176335     | .99631683     |

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

*According to the above estimated results, it indicated that using log-form can lead to more robust estimated results.*

- g. Make comparison of the estimated results of model (1) and model (2). Which estimated result should be used in this case? Why?

```
. est table nls1 nls2 nls3 nls4, star(.1 .05 .01) stat(N rss r2 r2_a)
```

| Variable | nls1 | nls2 | nls3 | nls4 |
|----------|------|------|------|------|
|----------|------|------|------|------|

|             |  |               |              |            |
|-------------|--|---------------|--------------|------------|
| -----+----- |  |               |              |            |
| gamma       |  |               |              |            |
| _cons       |  | 2.889e-17     | 15.206371    | 4.0000078  |
| -----+----- |  |               |              |            |
| delta       |  |               |              |            |
| _cons       |  | .80176096***  | .05477862    | 1.286e-07  |
| -----+----- |  |               |              |            |
| rho         |  |               |              |            |
| _cons       |  | -1.8829605*** | -38.857043   | -29.019904 |
| -----+----- |  |               |              |            |
| nu          |  |               |              |            |
| _cons       |  | 3.3958902***  | 1.0636331*** | 1***       |
| -----+----- |  |               |              |            |
| Statistics  |  |               |              |            |
| N           |  | 800           | 800          | 800        |
| rss         |  | 9.271e+18     | 1.351e+20    | 2.352e+20  |
| r2          |  | .96224959     | .44974701    | .04246041  |
| r2_a        |  | .96205989     | .44698192    | .03764866  |
| -----+----- |  |               |              |            |

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

```
. est table lognls1 lognls2 lognls3 lognls4, star(.1 .05 .01) stat(N rss r2
r2_a)
```

|             |  |               |               |               |
|-------------|--|---------------|---------------|---------------|
| -----+----- |  |               |               |               |
| Variable    |  | lognls1       | lognls2       | lognls3       |
| -----+----- |  |               |               |               |
| lngamma     |  |               |               |               |
| _cons       |  | 3.7988005***  | 3.7988004***  | 3.7997656***  |
| -----+----- |  |               |               |               |
| nu          |  |               |               |               |
| _cons       |  | .97272923***  | .97272923***  | .97270091***  |
| -----+----- |  |               |               |               |
| rho         |  |               |               |               |
| _cons       |  | -.80798268*** | -.80798318*** | -.80361634*** |
| -----+----- |  |               |               |               |
| delta       |  |               |               |               |
| _cons       |  | .23510249***  | .23510246***  | .23548043***  |
| -----+----- |  |               |               |               |
| Statistics  |  |               |               |               |
| N           |  | 800           | 800           | 800           |
| rss         |  | 819.99246     | 819.99246     | 819.99301     |
| r2          |  | .54348419     | .54348419     | .54348389     |
| r2_a        |  | .54176366     | .54176366     | .54176335     |
| -----+----- |  |               |               |               |

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

*According to the above estimated results, it indicated that log-form (model 2) should be employed since it leads to more robust estimated results.*