# Feb, 15 2020 Stata IV, 2SLS, GMM

## February 15, 2020

- Name: Jikhan Jeong
- Part 1: IV (2SLS base just-identified and over-identified)
- Ref: http://www3.grips.ac.jp/~yamanota/yamanoCourses.htm (lecture, code, data source) iverg IV 2SLS, 2SLS applied and se is fixed
- Part 2: 2SLS and GMM
- Ref: https://www.soderbom.net/metrix2.htm (lcture, code source): iverg2 2sls and GMM
- Ref: https://kylebarron.dev/stata\_kernel/ (stata kernel)

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## 0.1 Data: CARD.dta | Wooldridge probm 5.4-6.1

## 0.2 # Data Preparing

[1]: use "card.dta", clear

[4]: %head 1

[5]: sum

| Max  | Min | Std. Dev. | Mean     | Obs   | Variable |
|------|-----|-----------|----------|-------|----------|
| 5225 | 2   | 1500.539  | 2581.749 | 3,010 | id       |
| 1    | 0   | .4965731  | .4408638 | 3,010 | nearc2   |
| 1    | 0   | .4657535  | .6820598 | 3,010 | nearc4   |
| 18   | 1   | 2.676913  | 13.26346 | 3,010 | educ     |

| age      | 3,010 | 28.1196  | 3.137004  | 24      | 34       |
|----------|-------|----------|-----------|---------|----------|
| fatheduc | 2,320 | 10.00345 | 3.720737  | 0       | 18       |
| motheduc | 2,657 | 10.34814 | 3.179671  | 0       | 18       |
| weight   | 3,010 | 321185.3 | 170645.8  | 75607   | 1752340  |
| momdad14 | 3,010 | .7893688 | .4078247  | 0       | 1        |
| sinmom14 | 3,010 | .1006645 | .3009339  | 0       | 1        |
| step14   | 3,010 | .0388704 | .1933182  | 0       | 1        |
| reg661   | 3,010 | .0465116 | .2106253  | 0       | 1        |
| reg662   | 3,010 | .1607973 | .367405   | 0       | 1        |
| reg663   | 3,010 | .1956811 | .39679    | 0       | 1        |
| reg664   | 3,010 | .0641196 | .2450066  | 0       | 1        |
| reg665   | 3,010 | .2083056 | .406164   | 0       | 1        |
| reg666   | 3,010 | .0960133 | .2946584  | 0       | 1        |
| reg667   | 3,010 | .1099668 | .3129003  | 0       | 1        |
| reg668   | 3,010 | .0282392 | .165683   | 0       | 1        |
| reg669   | 3,010 | .0903654 | .2867522  | 0       | 1        |
| south66  | 3,010 | .4142857 | .4926801  | 0       | 1        |
| black    | 3,010 | .2335548 | .4231624  | 0       | 1        |
| smsa     | 3,010 | .7129568 | .4524571  | 0       | 1        |
| south    | 3,010 | .4036545 | .4907113  | 0       | 1        |
| smsa66   | 3,010 | .6495017 | .4772053  | 0       | 1        |
| wage     | 3,010 | 577.2824 | 262.9583  | 100     | 2404     |
| enroll   | 3,010 | .0923588 | . 2895799 | 0       | 1        |
| KWW      | 2,963 | 33.54067 | 8.611619  | 4       | 56       |
| IQ       | 2,061 | 102.4498 | 15.42376  | 50      | 149      |
| married  | 3,003 | 2.271395 | 2.066823  | 1       | 6        |
| libcrd14 | 2,997 | .674341  | .4686987  | 0       | 1        |
| exper    | 3,010 | 8.856146 | 4.141672  | 0       | 23       |
| lwage    | 3,010 | 6.261832 | .4437976  | 4.60517 | 7.784889 |
| expersq  | 3,010 | 95.57907 | 84.61831  | 0       | 529      |

## 0.2.1 IV

 $\bullet \;\; \mathbf{educ}$  is endogeneous variable

.

# 0.3 x = correlated with error, E(Xe) = non-zero

[6]: reg lwage educ

| Source   | SS         | df        | MS        | Numbe    | er of obs | =              | 3,010     |
|----------|------------|-----------|-----------|----------|-----------|----------------|-----------|
| +        |            |           |           | - F(1,   | 3008)     | =              | 329.54    |
| Model    | 58.5153704 | 1         | 58.515370 | 94 Prob  | > F       | =              | 0.0000    |
| Residual | 534.126274 | 3,008     | .17756857 | '5 R-sqı | ıared     | =              | 0.0987    |
| +        |            |           |           | - Adj I  | R-squared | =              | 0.0984    |
| Total    | 592.641645 | 3,009     | .19695634 | 6 Root   | MSE       | =              | .42139    |
|          |            |           |           |          |           |                |           |
| lwage    | Coef.      | Std. Err. |           | P> t     |           |                | Interval] |
| educ     |            | .0028697  | 18.15     | 0.000    | .046467   |                | .057721   |
| _cons    | 5.570882   | .0388295  | 143.47    | 0.000    | 5.49474   | <del>1</del> 7 | 5.647017  |

## [12]: corr educ nearc4

(obs=3,010)

| educ nearc4 -----educ | 1.0000 nearc4 | 0.1442 1.0000

# [13]: reg educ nearc4

| Source              | SS                       | df         | MS                       |                        | er of obs                 | =           | 3,010<br>63.91             |
|---------------------|--------------------------|------------|--------------------------|------------------------|---------------------------|-------------|----------------------------|
| Model  <br>Residual | 448.604204<br>21113.4759 | 1<br>3,008 | 448.604204<br>7.01910767 | Prob<br>R-squ<br>Adj I | > F<br>uared<br>R-squared | =<br>=<br>= | 0.0000<br>0.0208<br>0.0205 |
| Total               | 21562.0801               | 3,009      | 7.16586243               | Root                   | MSE<br>                   | =           | 2.6494                     |
| educ                | Coef.                    | Std. Err.  | -                        | P> t <br>              | 20070                     |             | Interval]                  |
| nearc4  <br>_cons   | .829019<br>12.69801      | .1036988   |                          | 0.000                  | .6256912<br>12.53009      |             | 1.032347<br>12.86594       |

## [17]: ivreg lwage (educ=nearc4)

## Instrumental variables (2SLS) regression

| Source   | SS<br>     | df        | MS                |       |                 | =   | 3,010<br>51.17 |
|----------|------------|-----------|-------------------|-------|-----------------|-----|----------------|
| Model    |            |           | -340.11155 Prob > |       |                 | =   | 0.0000         |
| Residual | 932.753194 | 3,008     | .310090823 R-squa |       | ared            | =   |                |
| Total    |            |           | .19695634         | ū     | -squared<br>MSE | =   | . 55686        |
| lwage    | Coef.      | Std. Err. |                   | P> t  | 2 - 70          | nf. | Interval]      |
| educ     | .1880626   | .0262913  | 7.15              | 0.000 | .136511         | 8   | .2396135       |
| _cons    | 3.767472   | .3488617  | 10.80             | 0.000 | 3.0834          | 4   | 4.451503       |
| T        |            |           |                   |       |                 |     |                |

Instrumented: educ
Instruments: nearc4

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# OLS (educ = endo variable)

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## 0.4 edu coefficient: .074009 edu sd: .0035054 adR: 0.2891

# [18]: reg lwage educ exper expersq black smsa south

| Source   | SS<br>     | df        |            |          | er of obs<br>3003) | =      | 3,010<br>204.93 |
|----------|------------|-----------|------------|----------|--------------------|--------|-----------------|
| Model    | 172.165628 | 6         | 28.6942714 | Prob     |                    | =      | 0.0000          |
| Residual | 420.476016 | 3,003     | .140018653 | R-sq     | uared              | =      | 0.2905          |
| +-       |            |           |            | Adj      | R-squared          | =      | 0.2891          |
| Total    | 592.641645 | 3,009     | .196956346 | Root     | MSE                | =      | .37419          |
| lwage    | Coef.      | Std. Err. | t 1        | <br>P> t | [95% Con           | <br>f. | Interval]       |
|          | 074000     | 0025054   | 04 44      |          | 0674957            |        | 000000          |
| educ     | .074009    | .0035054  |            | 0.000    | .0671357           |        | .0808823        |
| exper    | .0835958   | .0066478  | 12.57      | 0.000    | .0705612           |        | .0966305        |
| expersq  | 0022409    | .0003178  | -7.05      | 0.000    | 0028641            |        | 0016177         |
| black    | 1896315    | .0176266  | -10.76     | 0.000    | 2241929            |        | 1550702         |
| smsa     | .161423    | .0155733  | 10.37      | 0.000    | .1308876           |        | .1919583        |
| south    | 1248615    | .0151182  | -8.26      | 0.000    | 1545046            |        | 0952184         |
| cons     | 4.733664   | .0676026  | 70.02      | 0.000    | 4.601112           |        | 4.866216        |

## [19]: ivreg lwage (educ= nearc2 nearc4) exper expersq black smsa south

Instrumental variables (2SLS) regression

| Source   | SS         | df        | MS         | Number of obs | s =<br>= | 3,010<br>110.30 |
|----------|------------|-----------|------------|---------------|----------|-----------------|
| Model    | 86.2367703 | 6         | 14.3727951 | Prob > F      | =        | 0.0000          |
| Residual | 506.404874 | 3,003     | .168632992 | R-squared     | =        | 0.1455          |
| +-       |            |           |            | Adj R-squared | d =      | 0.1438          |
| Total    | 592.641645 | 3,009     | .196956346 | Root MSE      | =        | .41065          |
|          |            |           |            |               |          |                 |
|          |            |           |            |               |          |                 |
| lwage    | Coef.      | Std. Err. | t F        | P> t  [95% (  | Conf.    | Interval]       |

| lwage   | Coef.    | Std. Err. | t     | P> t  | [95% Conf. | Interval] |
|---------|----------|-----------|-------|-------|------------|-----------|
| educ    | .1608487 | .0486291  | 3.31  | 0.001 | .065499    | .2561984  |
| exper   | .1192112 | .0211779  | 5.63  | 0.000 | .0776866   | .1607358  |
| expersq | 0023052  | .0003507  | -6.57 | 0.000 | 0029928    | 0016177   |
| black   | 1019726  | .0526187  | -1.94 | 0.053 | 2051449    | .0011997  |
| smsa    | .1165736 | .0303135  | 3.85  | 0.000 | .0571362   | .1760109  |
| south   | 0951187  | .0234721  | -4.05 | 0.000 | 1411418    | 0490956   |
| _cons   | 3.272102 | .8192563  | 3.99  | 0.000 | 1.665742   | 4.878462  |
|         |          |           |       |       |            |           |

Instrumented: educ

Instruments: exper expersq black smsa south nearc2 nearc4

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[20]: ivreg lwage (educ= nearc2 nearc4 fatheduc motheduc) exper expersq black smsa\_u south

Instrumental variables (2SLS) regression

| Source          | SS                   | df                | MS                           | Number of obs                | =                  | 2,220              |
|-----------------|----------------------|-------------------|------------------------------|------------------------------|--------------------|--------------------|
| +-              |                      |                   |                              | F(6, 2213)                   | =                  | 83.66              |
| Model           | 108.419494           | 6                 | 18.0699157                   | Prob > F                     | =                  | 0.0000             |
| Residual        | 320.580009           | 2,213             | .144862182                   | R-squared                    | =                  | 0.2527             |
| +-              |                      |                   |                              | Adj R-squared                | =                  | 0.2507             |
| Total           | 428.999503           | 2,219             | .193330105                   | Root MSE                     | =                  | .38061             |
|                 |                      | •                 |                              |                              |                    |                    |
|                 |                      |                   |                              |                              |                    |                    |
|                 |                      |                   |                              |                              |                    |                    |
| <br>lwage       | Coef.                | Std. Err.         | <br>t F                      | <br>P> t  [95% C             | <br>onf.           | Interval]          |
| lwage           |                      |                   |                              | ?> t  [95% C                 | <br>onf.           | Interval]          |
| lwage  <br>     |                      |                   |                              |                              |                    | Interval] .1248392 |
|                 |                      |                   | 7.92                         |                              | <br>34             |                    |
|                 | .1000713             | .01263            | 7.92 0<br>10.43 0            | 0.000 .07530                 | <br>34<br>96       | .1248392           |
| educ  <br>exper | .1000713<br>.0989441 | .01263<br>.009482 | 7.92 0<br>10.43 0<br>-6.10 0 | ).000 .07530<br>).000 .08034 | <br>34<br>96<br>59 | .1248392           |

 south | -.1072406
 .0180661
 -5.94
 0.000
 -.1426688
 -.0718123

 \_cons | 4.26178
 .216812
 19.66
 0.000
 3.836604
 4.686956

<del>-</del>

Instrumented: educ

Instruments: exper expersq black smsa south nearc2 nearc4 fatheduc

motheduc

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#### 1. down load user written package: iverg2\_\_\_

[22]: ssc install ivreg2

ssc install ranktest

checking ivreg2 consistency and verifying not already installed... installing into /home/jikhan.jeong/ado/plus/... installation complete.

checking ranktest consistency and verifying not already installed... installing into /home/jikhan.jeong/ado/plus/... installation complete.

## [23]: tabstat lwage educ nearc2 , s(mean N min max p50)

| stats |   | lwage    | educ     | nearc2   |
|-------|---|----------|----------|----------|
| mean  | + | 6.261832 | 13.26346 | .4408638 |
| N     |   | 3010     | 3010     | 3010     |
| min   |   | 4.60517  | 1        | 0        |
| max   |   | 7.784889 | 18       | 1        |
| p50   | 1 | 6.286928 | 13       | 0        |

#### [25]: reg lwage educ

| Source              | SS                       | df         | MS         | Number of obs F(1, 3008)  | =          | 3,010<br>329.54 |
|---------------------|--------------------------|------------|------------|---------------------------|------------|-----------------|
| Model  <br>Residual | 58.5153704<br>534.126274 | 1<br>3,008 | .177568575 | Prob > F<br>R-squared     | =          | 0.0000          |
| Total               | 592.641645               | 3,009      | .196956346 | Adj R-squared<br>Root MSE | =<br>=<br> | 0.0984          |

| lwage | Coef.    | Std. Err. | t     | P> t  | [95% Conf | . Interval] |
|-------|----------|-----------|-------|-------|-----------|-------------|
| educ  | .0520942 | .0028697  | 18.15 | 0.000 | .0464674  | .057721     |

\_cons | 5.570882 .0388295 143.47 0.000 5.494747 5.647017

result

- (1stage) nearc2 | .2552584 .0981804 2.60 p-value 0.009 1st, Y= educ (=endo var)
- (IV) educ | .3432739 .1274114 2.69 p-value 0.007
- (OLS) educ | coef |.0520942 « (IV) educ|coeff |.3432739

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 $0.5 \quad (OLS) \ educ \mid sd \mid .0028697 \ « \ (IV) \ educ \mid coeff \mid .1274114$ 

[29]: ivreg2 lwage ( educ = nearc2 ), first

First-stage regressions

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First-stage regression of educ:

Statistics consistent for homoskedasticity only

Number of obs =

3010

| educ   |          | Std. Err. |      | • • • | 2 - 1,0  | _ |
|--------|----------|-----------|------|-------|----------|---|
| nearc2 | .2552584 | .0981804  | 2.60 | 0.009 | .0627509 |   |

F test of excluded instruments:

F(1, 3008) = 6.76

Prob > F = 0.0094

Sanderson-Windmeijer multivariate F test of excluded instruments:

F(1, 3008) = 6.76

Prob > F = 0.0094

Summary results for first-stage regressions

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(Underid) (Weak id)

Variable | F( 1, 3008) P-val | SW Chi-sq( 1) P-val | SW F( 1, 3008)

educ | 6.76 0.0094 | 6.76 0.0093 | 6.76

Stock-Yogo weak ID F test critical values for single endogenous regressor:

| 10% | ${\tt maximal}$ | IV         | size | 16.38 |
|-----|-----------------|------------|------|-------|
| 15% | ${\tt maximal}$ | ${\tt IV}$ | size | 8.96  |
| 20% | ${\tt maximal}$ | IV         | size | 6.66  |
| 25% | maximal         | TV         | size | 5.53  |

Source: Stock-Yogo (2005). Reproduced by permission.

NB: Critical values are for Sanderson-Windmeijer F statistic.

#### Underidentification test

Ho: matrix of reduced form coefficients has rank=K1-1 (underidentified)

Ha: matrix has rank=K1 (identified)

Anderson canon. corr. LM statistic Chi-sq(1)=6.75 P-val=0.0094

Weak identification test

Ho: equation is weakly identified

Cragg-Donald Wald F statistic 6.76

Stock-Yogo weak ID test critical values for K1=1 and L1=1:

| 10% maximal | IV | size | 16.38 |
|-------------|----|------|-------|
| 15% maximal | IV | size | 8.96  |
| 20% maximal | IV | size | 6.66  |
| 25% maximal | ΙV | size | 5.53  |

Source: Stock-Yogo (2005). Reproduced by permission.

#### Weak-instrument-robust inference

Tests of joint significance of endogenous regressors B1 in main equation Ho: B1=0 and orthogonality conditions are valid

| Anderson-Rubin Wald test    | F(1,3008)= | 29.20 | P-val=0.0000 |
|-----------------------------|------------|-------|--------------|
| Anderson-Rubin Wald test    | Chi-sq(1)= | 29.21 | P-val=0.0000 |
| Stock-Wright LM S statistic | Chi-sq(1)= | 28.93 | P-val=0.0000 |

| ${\tt Number}$ | of | observations          | N  | = | 3010 |
|----------------|----|-----------------------|----|---|------|
| ${\tt Number}$ | of | regressors            | K  | = | 2    |
| ${\tt Number}$ | of | endogenous regressors | K1 | = | 1    |
| ${\tt Number}$ | of | instruments           | L  | = | 2    |
| Number         | of | excluded instruments  | L1 | = | 1    |

#### IV (2SLS) estimation

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Estimates efficient for homoskedasticity only Statistics consistent for homoskedasticity only

Number of obs = 3010 F(1, 3008) = 7.25 Prob > F = 0.0071 Total (centered) SS = 592.6416447 Centered R2 = -2.9860 Total (uncentered) SS = 118616.3653 Uncentered R2 = 0.9801

| Residual SS      | =            | 2362.280102      |           | R         | oot MSE       | = .8859   |
|------------------|--------------|------------------|-----------|-----------|---------------|-----------|
|                  | Coef.        | Std. Err.        | z         | P> z      | [95% Conf.    | Interval] |
| •                |              |                  |           |           | .0935522      |           |
|                  |              |                  |           |           | -1.60349      |           |
| Underidentificat |              |                  |           |           | istic):       |           |
|                  |              |                  |           | Chi-      | sq(1) P-val = | 0.0094    |
| Weak identificat | ion test (   | <br>Traσσ-Donald | Wald F    | statistic | )·            | 6.759     |
| Stock-Yogo weak  |              |                  |           |           |               | 16.38     |
|                  |              |                  |           | aximal IV |               | 8.96      |
|                  |              |                  | 20% ma    | aximal IV | size          | 6.66      |
|                  |              |                  | 25% ma    | aximal IV | size          | 5.53      |
| Source: Stock-Yo | ogo (2005).  | Reproduced       | by permi  | ission.   |               |           |
| Sargan statistic | : (overident | tification te    | est of al | ll instru | <br>ments):   | 0.000     |
| · ·              |              |                  |           | (equat    | ion exactly i |           |
|                  | educ         |                  |           |           |               |           |
| Excluded instrum |              |                  |           |           |               |           |
| tabstat lwage e  |              |                  |           |           |               |           |

Summary statistics: mean

by categories of: nearc2 (=1 if near 2 yr college, 1966)

| nearc2 |   | lwage                | educ                 |
|--------|---|----------------------|----------------------|
| 1      | İ | 6.223202<br>6.310825 | 13.15092<br>13.40618 |
|        | • | 6.261832             |                      |

- IV coef with wald estimator : when # of IV = # endo var = 1 and dummy
- [E(y|IV=1)-E(y|IV=0)] / [E(x|IV=1)-E(x|IV=0)] = 6.310825 6.223202)/(13.40618-13.15092) = 0.34326960745 = (IV) educ\$coeff 0.3432739

[37]: ivreg2 lwage (educ=nearc2 nearc4) exper expersq black south smsa reg661 reg662⊔ →reg663 reg664 reg665 reg666 reg667 reg668 south66

Warning - collinearities detected

Vars dropped: south66

IV (2SLS) estimation

Estimates efficient for homoskedasticity only Statistics consistent for homoskedasticity only

|                     |              |               |           |          | Number of obs   | = 3010    |
|---------------------|--------------|---------------|-----------|----------|-----------------|-----------|
|                     |              |               |           |          | F( 14, 2995)    | = 48.20   |
|                     |              |               |           |          | Prob > F        | = 0.0000  |
| Total (centered     | a) SS =      | 592.6416447   |           |          | Centered R2     | = 0.1320  |
| Total (uncenter     | red) SS =    | 118616.3653   |           |          | Uncentered R2   | = 0.9957  |
| Residual SS         | =            | 514.4136847   |           |          | Root MSE        | = .4134   |
|                     |              |               |           |          |                 |           |
| lwage               | Coef.        | Std. Err.     | Z         | P> z     | [95% Conf.      | Interval] |
| educ                | .168382      | .0508209      | 3.31      | 0.001    | .0687747        | . 2679892 |
| exper               | .1234909     | .0221606      | 5.57      | 0.000    | .0800569        | .166925   |
| expersq             | 002363       | .0003543      | -6.67     | 0.000    | 0030575         | 0016685   |
| black               | 1133767      | .0510411      | -2.22     | 0.026    | 2134154         | 0133381   |
| south               | 1409819      | .0288211      | -4.89     | 0.000    | 1974701         | 0844936   |
| smsa                | .1044526     | .031661       | 3.30      | 0.001    | .0423983        | .166507   |
| reg661              | 1014153      | .0442295      | -2.29     | 0.022    | 1881034         | 0147271   |
| reg662              | .0025296     | .0342178      | 0.07      | 0.941    | 064536          | .0695952  |
| reg663              | .0492832     | .0331164      | 1.49      | 0.137    | 0156238         | .1141902  |
| reg664              | 0574669      | .0398466      | -1.44     | 0.149    | 1355648         | .0206311  |
| reg665              | .0536101     | .048416       | 1.11      | 0.268    | 0412835         | .1485037  |
| reg666              | .0710579     | .0543492      | 1.31      | 0.191    | 0354647         | .1775804  |
| reg667              | .0414306     | .0506196      | 0.82      | 0.413    | 057782          | .1406432  |
| reg668              | 20171        | .0532987      | -3.78     | 0.000    | 3061736         | 0972464   |
| south66             | 0            | (omitted)     |           |          |                 |           |
| _cons               | 3.151123     | .8666924      | 3.64      | 0.000    | 1.452437        | 4.849809  |
| Underidentifica     | ation test ( | Anderson cand | on. corr  | . LM sta | atistic):       | 17.577    |
|                     | ·            |               |           |          | i-sq(2) P-val = |           |
| Weak identification | ation test ( | Cragg-Donald  | Wald F    | statisti | ic):            | 8.793     |
| Stock-Yogo weak     | ID test cr   | itical values | s: 10% ma | aximal 1 | [V size         | 19.93     |
|                     |              |               | 15% ma    | aximal 1 | [V size         | 11.59     |
|                     |              |               | 20% ma    | aximal 1 | IV size         | 8.75      |
|                     |              |               | 25% ma    | aximal 1 | IV size         | 7.25      |
| Source: Stock-Y     | 7ogo (2005). | Reproduced    | by perm:  | ission.  |                 |           |
| Sargan statisti     | c (overiden  | tification te | est of a  | ll insti | ruments):       | 1.227     |
| <u> </u>            | ,            |               | -         |          | i-sq(1) P-val = |           |
|                     |              |               |           |          |                 |           |

Instrumented: educ

Included instruments: exper expersq black south smsa reg661 reg662 reg663

reg664 reg665 reg666 reg667 reg668

Excluded instruments: nearc2 nearc4

Dropped collinear: south66

\_\_\_\_\_\_

[33]: ivreg2 lwage (educ=nearc2 nearc4 motheduc fatheduc ) exper expersq black south

→smsa reg661 reg662 reg663 reg664 reg665 reg666 reg667 reg668

→south66,endog(educ)

Warning - collinearities detected

Vars dropped: south66

IV (2SLS) estimation

Estimates efficient for homoskedasticity only Statistics consistent for homoskedasticity only

\_\_\_\_\_\_ lwage | Coef. Std. Err. z P>|z| [95% Conf. Interval] .1280912 educ | .1033048 .0126463 8.17 0.000 .0785185 exper | .1011632 .0094696 10.68 0.000 .0826032 .1197231 expersq | -.0024937 .0003997 -6.24 0.000 -.0032772 -.0017103 black | -.1549154 .0261189 -5.93 0.000 -.2061075 -.1037234 south | -.1210386 .0314149 -3.85 0.000 -.1826106 -.0594666 smsa | .1407334 .0200711 .180072 7.01 0.000 .1013947 -.1714171 .0092282 reg661 | -.0810944 .0460838 -1.76 0.078 reg662 | .0055485 .0322823 0.17 0.864 -.0577237 .0688207 reg663 | .0402969 .0316206 1.27 0.203 -.0216783 .1022721 reg664 | -.0561783 .0406292 -1.38 0.167 -.1358101 .0234535 0.19 0.852 -.0753372 .0911602 reg665 | .0079115 .0424746 reg666 | .0219974 .0488073 0.45 0.652 -.0736632 .117658 reg667 | .0129433 .0463937 0.28 0.780 -.0779866 .1038732 reg668 | -.1615825 .0524362 -3.08 0.002 -.2643555 -.0588094 south66 | 0 (omitted) \_cons | 4.214819 .2213337 19.04 0.000 3.781013 4.648625

Underidentification test (Anderson canon. corr. LM statistic): 232.919

Chi-sq(4) P-val = 0.0000-----Weak identification test (Cragg-Donald Wald F statistic): 64.528 Stock-Yogo weak ID test critical values: 5% maximal IV relative bias 16.85 10% maximal IV relative bias 10.27 20% maximal IV relative bias 6.71 30% maximal IV relative bias 5.34 10% maximal IV size 24.58 15% maximal IV size 13.96 20% maximal IV size 10.26 25% maximal IV size 8.31 Source: Stock-Yogo (2005). Reproduced by permission. \_\_\_\_\_\_ Sargan statistic (overidentification test of all instruments): Chi-sq(3) P-val = 0.0720-endog- option: Endogeneity test of endogenous regressors: 4.919 Chi-sq(1) P-val = 0.0266Regressors tested: educ \_\_\_\_\_\_ Instrumented: Included instruments: exper expersq black south smsa reg661 reg662 reg663 reg664 reg665 reg666 reg667 reg668 Excluded instruments: nearc2 nearc4 motheduc fatheduc Dropped collinear: south66

[35]: ivreg2 lwage (educ=nearc2 nearc4 motheduc fatheduc ) exper expersq black south →smsa reg661 reg662 reg663 reg664 reg665 reg666 reg667 reg668 south66, robust →endog(educ)

Warning - collinearities detected

Vars dropped: south66

IV (2SLS) estimation \_\_\_\_\_

Estimates efficient for homoskedasticity only Statistics robust to heteroskedasticity

Number of obs = 2220 F(14, 2205) = 41.01Prob > F = 0.0000Centered R2 = 0.2580Total (centered) SS = 428.9995035 Total (uncentered) SS = 88133.52217Uncentered R2 = 0.9964Residual SS = 318.3363362 Root MSE = .3787

|  |             | Robust        |            |           | 5               |                   |
|--|-------------|---------------|------------|-----------|-----------------|-------------------|
| lwage  | Coe         | f. Std. Er    | r. z       | P> z      | [95% Conf.      | Interval          |
| educ   | .10330      | 48 .013185    | 5 7.83     | 0.000     | .0774616        | .129148           |
| exper  |             |               |            | 0.000     | .0821449        | .1201814          |
| expersq  |             |               |            | 0.000     | 0033021         | 0016853           |
| black  |             |               |            | 0.000     | 2067194         | 1031114           |
| south  |             |               |            | 0.000     | 1882204         | 0538568           |
| smsa   |             |               | 7 7.25     | 0.000     | .1026753        | .1787914          |
| reg661   | 08109       | 44 .045612:   | 2 -1.78    | 0.075     | 1704927         | .0083038          |
| reg662   | .00554      | .033572       | 4 0.17     | 0.869     | 0602521         | .0713492          |
| reg663   | .04029      | .032465       | 7 1.24     | 0.215     | 0233347         | .1039284          |
| reg664   | 05617       | .041066       | 6 -1.37    | 0.171     | 1366673         | .0243107          |
| reg665   | .00791      | .04516        | 4 0.18     | 0.861     | 0806083         | .0964313          |
| reg666   | .02199      | 74 .049051    | 1 0.45     | 0.654     | 0741409         | .1181357          |
| reg667   | .01294      | 33 .047954    | 6 0.27     | 0.787     | 081046          | .1069326          |
| reg668   |             | 25 .05536     | 1 -2.92    | 0.004     | 270088          | 053077            |
| south66  |             | 0 (omitted)   | )          |           |                 |                   |
| _cons  | 4.2148      | 19 .229652    | 4 18.35    | 0.000     | 3.764708        | 4.664929          |
| Indonidon+ifi  |             |               |            |           | +:              | 162 546           |
| Underidentific   | acion tes   | r (vierperge  | п-гаар ГК. |           | -sq(4) P-val =  | 163.546<br>0.0000 |
|  |             |               |            |           |                 |                   |
| Weak identific   | cation tes  | t (Cragg-Don  | ald Wald F | statisti  | c):             | 64.528            |
|  |             | (Kleiberge    | n-Paap rk  | Wald F st | atistic):       | 54.902            |
| Stock-Yogo weak ID test critical values: 5% maximal IV relative bias 16.85 |             |               |            |           |                 |                   |
|  |             |               | 10% 1      | maximal I | V relative bias | s 10.27           |
| 20% maximal IV relative bias 6.71  |             |               |            |           |                 |                   |
|  |             |               |            |           | V relative bias |                   |
|  |             |               |            | maximal I |                 | 24.58             |
|  |             |               |            | maximal I |                 | 13.96             |
|  |             |               |            | maximal I |                 | 10.26             |
|  |             |               |            | maximal I | V size          | 8.31              |
| Source: Stock-   | O           | -             | 0 1        |           |                 |                   |
|  |             |               |            |           | nd i.i.d. erro  |                   |
|  |             |               |            |           | truments):      |                   |
| nansen J stat.   | ISCIC (OVE. | ridentificat. | ion test o |           | -sq(3) P-val =  |                   |
| -endog- option   | 1.          |               |            | OHI       | bq(o) i vai     | 0.0001            |
| Endogeneity to   |             | ngenous regr  | essors.    |           |                 | 4.161             |
| madgementy of  | 550 01 0HQ  | 08011000 1081 | CDDOID.    | Chi       | -sq(1) P-val =  |                   |
| Regressors tes   |             |               |            |           | -               |                   |
|  |             |               |            |           |                 |                   |
| Instrumented:  |             | duc           | block com  | th amas m | om661 mom660 m  | ~662              |
| Included inst  |             |               |            |           | eg661 reg662 re | egoos             |
| Excluded inst  |             | eg664 reg665  | •          |           | UU              |                   |
| Dropped collin   |             | outh66        | mooneduc . | Latineuuc |                 |                   |
| probbed corru  | rear. S     |               |            |           |                 |                   |

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[36]: ivreg2 lwage (educ=nearc2 nearc4 motheduc fatheduc ) exper expersq black south

→smsa reg661 reg662 reg663 reg664 reg665 reg666 reg667 reg668 south66, gmm2s

→robust endog(educ)

Warning - collinearities detected Vars dropped: south66

2-Step GMM estimation

Estimates efficient for arbitrary heteroskedasticity Statistics robust to heteroskedasticity

|                       |   |             | Number of obs | = | 2220   |
|-----------------------|---|-------------|---------------|---|--------|
|                       |   |             | F( 14, 2205)  | = | 41.36  |
|                       |   |             | Prob > F      | = | 0.0000 |
| Total (centered) SS   | = | 428.9995035 | Centered R2   | = | 0.2593 |
| Total (uncentered) SS | = | 88133.52217 | Uncentered R2 | = | 0.9964 |
| Residual SS           | = | 317.7482854 | Root MSE      | = | .3783  |

Robust lwage | Coef. Std. Err. z P>|z| [95% Conf. Interval] educ | .1019251 .0131539 7.75 0.000 .0761439 .1277063 10.37 0.000 exper | .1005025 .009696 .0814987 .1195062 expersq | -.0024961 .0004124 -6.05 0.000 -.0033044 -.0016877 black | -.1581387 .0263309 -6.01 0.000 -.2097464 -.1065311 south | -.1178039 .0342158 -3.44 0.001 -.1848655 -.0507422 7.32 smsa | 0.000 .1798568 . 1418818 .0193754 .1039068 -1.88 0.060 reg661 | -.0856218 .0454736 -.1747484 .0035047 reg662 | .0045187 .033528 0.13 0.893 -.0611949 .0702323 reg663 | .0324063 1.19 0.233 .1021271 .0386119 -.0249033 reg664 | -.0576173 -1.40 0.160 .0410222 -.1380193 .0227847 .0030289 .0451069 0.07 0.946 reg665 | -.0853789 .0914368 reg666 | 0.24 0.813 .0115389 .0487421 -.0839939 .1070716 reg667 | .0070103 .0478721 0.15 0.884 -.0868174 .100838 reg668 | -.1677087 .0552444 -3.04 0.002 -.2759856 -.0594317 south66 | 0 (omitted) cons 4.240126 .2290215 18.51 0.000 3.791253 4.689

Underidentification test (Kleibergen-Paap rk LM statistic): 163.546

Chi-sq(4) P-val = 0.0000

Weak identification test (Cragg-Donald Wald F statistic): 64.528 (Kleibergen-Paap rk Wald F statistic): 54.902

| Stock-Yogo weak ID test o                            | critical values: 5% maxim  | al IV relative bias   | 16.85  |  |  |  |
|--|--|-----------------------|--------|--|--|--|
|  | 10% maxim  | al IV relative bias   | 10.27  |  |  |  |
|  | 20% maxim  | al IV relative bias   | 6.71   |  |  |  |
|  | 30% maxim  | al IV relative bias   | 5.34   |  |  |  |
|  | 10% maxin  | al IV size            | 24.58  |  |  |  |
|  | 15% maxin  | al IV size            | 13.96  |  |  |  |
|  | 20% maxim  | al IV size            | 10.26  |  |  |  |
|  |  | al IV size            | 8.31   |  |  |  |
| _  | ). Reproduced by permissi  |                       |        |  |  |  |
| NB: Critical values are f                            | for Cragg-Donald F statist   | ic and i.i.d. errors. |        |  |  |  |
| H I -t-t   | Hansen J statistic (overidentification test of all instruments): 6.602 |                       |        |  |  |  |
| Hansen J Statistic (over)                            | identification test of all   |                       | 6.602  |  |  |  |
| andam antian.  |  | Chi-sq(3) P-val =     | 0.0857 |  |  |  |
| <pre>-endog- option: Endogeneity test of endog</pre> | monous rogrossors:   |                       | 4.161  |  |  |  |
| Endogeneity test of endog                            | genous regressors.   | Chi-sq(1) P-val =     |        |  |  |  |
| Regressors tested: edu                               | n.c  | oni sq(i) i vai -     | 0.0414 |  |  |  |
|  |  |                       |        |  |  |  |
| Instrumented: edu                                    | uc   |                       |        |  |  |  |
| Included instruments: exp                            | per expersq black south sm   | sa reg661 reg662 reg6 | 63     |  |  |  |
| -  | g664 reg665 reg666 reg667  |                       |        |  |  |  |
| _  | arc2 nearc4 motheduc fathe   | ~                     |        |  |  |  |
| Dropped collinear: sou                               | uth66  |                       |        |  |  |  |
|  |  |                       |        |  |  |  |