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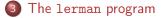
Bruno Damásio and David Neves

Portuguese Stata Users Group meeting









### 4 An example



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• The impact of economic trends and government policies on the distribution of income is a central topic in economic analysis

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- Income inequality is, at last, becoming a major concern for public policy in the western economies
- Thus, it is crucial to have rigorous tools to evaluate the sources of income inequality and the efectiveness of the goverment's social policies

## Motivation

- Lerman and Yitzhaki (1985) proposed a methodology to decompose the Gini coefficient
- López-Feldman (2006) presented a Stata module to operationalize Lerman and Yitzhaki's method (descogini)
- However it does not allow the usage of sampling weights
- That considerably narrows its application to surveys that collect information on household income dynamics, such as the PSID in the USA and the EU-SILC in the EU.
- Due to the sampling design of these surveys, the estimates come biased whenever sampling weights are excluded from the statistical analysis

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### Gini index decomposition

• Lerman and Yitzhaki shown that the Gini index can be written as follows:

$$G = \sum_{k=1}^{K} S_k G_k R_k$$

- G is the Gini index
- $S_k$  is the the share of the k th source in total income
- *G<sub>k</sub>* is the source Gini corresponding to the distribution of income from source *k*
- *R<sub>k</sub>* represents the correlation between income from source *k* with the distribution of total income

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### Gini index decomposition

- *S<sub>k</sub>* represents the relative importance of the *k th* income source
- *G<sub>k</sub>* gives us an idea of the (in)equality of the distribution of income from source *k*
- *R<sub>k</sub>* is a measure of the strength and direction of the linear relationship between the source *k* and the distribution of total income

## Gini index decomposition

Advantages of this approach:

- It has an intuitive interpretation
- It allows us to identify which source of income mostly contributes to household income inequality
- It allows to understand how changes in particular income sources will affect overall income inequality
- The latter is particularly useful to evaluate the efectiveness of public transfers in reducing income inequality

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### Gini index decomposition

- Consider a change in the household income from source k equal to εY<sub>k</sub> (Y<sub>k</sub> is the income form k th source)
- It can be shown that the partial derivative of the overall Gini with respect to a percentage change in source k is

$$\frac{\delta G}{\delta \varepsilon} = S_k \left( G_k R_k - G \right) \tag{1}$$

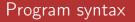
### Gini index decomposition

• Dividing (1) by G gives the source's marginal effect relative to the overall Gini:

$$\frac{\delta G/\delta\varepsilon}{G} = \frac{S_k G_k R_k}{G} - S_k \tag{2}$$

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- Which can be written as the source's inequality contribution as a percentage of the overall Gini minus the source's share of total income
- The sum of relative marginal effects is zero
- Multiplying all sources by  $\varepsilon$  leaves the overall Gini unchanged
- We can estimate the impact that a 1% change in income from source k will have on total income inequality



#### Syntax

#### lerman country year varlist [if] [in] [pw=weight]

- country = a string variable that includes one or more geographic units (countries, states, divisions, etc).
- year = a numeric variable that includes one or more time units

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• varlist = total income followed by its components

## US Panel Study of Income Dynamics

• To illustrate the program, we used the The Panel Study of Income Dynamics (PSID):

- Three waves: 1994, 2001 and 2013
- 13 US divisions and states
- 24.825 families
- Cross-sectional sampling weights

## US Panel Study of Income Dynamics

• Five equivalized income sources:

- employment (laboreq)
- self employment (laborselfeq)
- pensions (pensionseq)
- property (propertyeq)
- transfers (transferseq)

### lerman by year ignoring sampling weights

#### Figure : ignoring sampling weights

| . lerman USas | awhole yea | r totaleq la | boreq labors | elfeq propert | yeq pensions | eq transfers | eq          |             |           |
|---------------|------------|--------------|--------------|---------------|--------------|--------------|-------------|-------------|-----------|
| JS            |            |              |              |               |              |              |             |             |           |
| 1994 2001 201 | 3          |              |              |               |              |              |             |             |           |
| table 1994 US | [5.9]      |              |              |               |              |              |             |             |           |
|               | year_US    | source_US    | Rk_US        | Gk_US         | Gkadj_US     | Sk_US        | gini_US     | share_US    | delta_US  |
| laboreg       | 1994       | 1            | -            | .56882647     | .45343775    | .56936131    | .61007044   | .44805947   | 12130184  |
| laborselfeq   | 1994       | 2            | .71626324    | .98913374     | .58853577    | .01977884    | .61007044   | .02296934   | .0031905  |
| propertyeq    | 1994       | 3            | .84576306    | .98889716     | .86807204    | .10243482    | .61007044   | .14043245   | .03799763 |
| pensionseq    | 1994       | 4            | .74604999    | .94852981     | .78945434    | .22039411    | .61007044   | .25564595   | .03525184 |
| ransferseq    | 1994       | 5            | .92782517    | .99261316     | .96498348    | .08803091    | .61007044   | .13289279   | .04486187 |
| able_2001_US  | [5,9]      |              |              |               |              |              |             |             |           |
|               | year_US    | source_US    | Rk_US        | Gk_US Gk      | adj_US       | Sk_US gin    | i_US share  | _US delta_  | _US       |
| laboreq       | 2001       | 1            | .8433403 .   | 53632865 .44  | 436641 .62   | 88769 .5702  | 3961 .49881 | 79913005    | 589       |
| aborselfeq    | 2001       | 2            | .73296995    | .9895016 .65  | 124365 .020  | 21464 .5702  | 3961 .02571 | 055 .005495 | 591       |
| propertyeq    | 2001       | 3            | .77637384 .  | 99769785 .82  | 746423 .078  | 31979 .5702  | 3961 .10638 | 589 .028066 | 511       |
| pensionseq    | 2001       | 4            | .79778914 .9 | 96102607 .83  | 280868 .239  | 92811 .5702  | 3961 .32258 | 714 .082659 | 903       |
| ransferseq    | 2001       | 5            | .82032017    | .9896659 .94  | 163206 .032  | 66056 .5702  | 3961 .04649 | 843 .013837 | 787       |
| able_2013_US  | [5,9]      |              |              |               |              |              |             |             |           |
|               | year_US    | source_US    | Rk_US        | Gk_US         | Gkadj_US     | Sk_US        | gini_US     | share_US    | delta_US  |
| laboreq       | 2013       | 1            | .91050144    | .57372015     | .49050199    | .80558746    | .48434464   | .86883828   | .06325082 |
| aborselfeq    | 2013       | 2            | .70155329    | 1.0166361     | .70366458    | .01521114    | .48434464   | .02239925   | .00718811 |
| propertyeq    | 2013       | 3            | .67931407    | .93886415     | .84648213    | .06280746    | .48434464   | .08270469   | .01989722 |
| pensionseq    | 2013       | 4            | .19129855    | .85036711     | .46041918    | .09836782    | .48434464   | .03303822   | 0653296   |
| ransferseq    | 2013       | 5            | 20722359     | .90509821     | .497503      | .01802612    | .48434464   | 00698044    | 02500655  |
|               |            |              |              |               |              |              |             | -           | E →       |

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### lerman by year with sampling weights

#### Figure : considering sampling weights

| . lerman USas | awhole year | totaleq lab | oreq laborse | lfeq propert | yeq pensions | eq transfers | eq [pw=weigh | t]        |           |
|---------------|-------------|-------------|--------------|--------------|--------------|--------------|--------------|-----------|-----------|
| US            |             |             |              |              |              |              |              |           |           |
| 1994 2001 201 | 3           |             |              |              |              |              |              |           |           |
|               |             |             |              |              |              |              |              |           |           |
| table_1994_US | [5,9]       |             |              |              |              |              |              |           |           |
|               | year_US     | source_US   | Rk_US        | Gk_US        | Gkadj_US     | Sk_US        | gini_US      | share_US  | delta_US  |
| laboreq       | 1994        | 1           | .80786131    | .58988698    | .45284182    | .50389404    | .61104224    | .39298286 | 11091117  |
| laborselfeq   | 1994        | 2           | .68039861    | .98542972    | .57117286    | .02072377    | .61104224    | .0227398  | .00201603 |
| propertyeq    | 1994        | 3           | .82532097    | .94746728    | .8523925     | .11809904    | .61104224    | .15113402 | .03303498 |
| pensionseq    | 1994        | 4           | .75510845    | .92936316    | .77713907    | .29030802    | .61104224    | .33341304 | .04310502 |
| transferseq   | 1994        | 5           | .91555553    | .99380219    | .96170772    | .06697514    | .61104224    | .09973028 | .03275514 |
| table_2001_US | [5.9]       |             |              |              |              |              |              |           |           |
|               | year US     | source US   | Rk US        | Gk US        | Gkadj US     | Sk US        | gini US      | share US  | delta US  |
| laboreg       | 2001        | 1           | .81713498    | .56049799    | .4409935     | .56361774    | .58192654    | .44359266 | 12002508  |
| laborselfeg   | 2001        | 2           | .70713755    | .99679036    | .65255626    | .02143427    | .58192654    | .0259626  | .00452833 |
| propertyea    | 2001        | 3           | .73740652    | .9462024     | .8100832     | .08405958    | .58192654    | .10078829 | .01672871 |
| pensionseq    | 2001        | 4           | .79140708    | .94371761    | .81422127    | .29963093    | .58192654    | .38455678 | .08492585 |
| transferseq   | 2001        | 5           | .84553762    | .99301222    | .94798629    | .03125748    | .58192654    | .04509967 | .01384219 |
| table 2013 US | [5.9]       |             |              |              |              |              |              |           |           |
|               | year_US     | source_US   | Rk_US        | Gk_US        | Gkadi US     | Sk US        | aini US      | share US  | delta US  |
| laboreg       | 2013        | 1           | .87827637    | .61000913    | .48854786    | .74429226    | .47230659    | .84428104 | .09998877 |
| laborselfeg   | 2013        | 2           | .6510064     | 1.0330151    | .67684569    | .01629988    | .47230659    | .02320879 | .0069089  |
| propertyeq    | 2013        | 3           | .66420227    | .91932516    | .83593665    | .08035729    | .47230659    | .10388929 | .023532   |
| pensionseq    | 2013        | 4           | .13937729    | .77929625    | .41241162    | .14580692    | .47230659    | .03353117 | 11227575  |
| transferseq   | 2013        | 5           | 1885103      | .92894029    | .49391843    | .01324365    | .47230659    | 00491028  | 01815393  |
|               |             |             |              |              |              |              |              |           |           |
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## Conclusions: US 2013

- Labor income increases inequality and Gini coefficient
  - 1% change increases Gini by 0.099%
- Pensions decreases inequality
  - 1% change decreases Gini by 0.112%
- Social transfers decreases inequality
  - 1% change decreases Gini by 0.018%
- Social transfers and pensions are unequally distributed but have a equalizing effect on income distribution

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## Conclusions: US over years

- The household income inequality of gross income have been decreasing (0.6110> 0.5819 > 0.4723)
- The social transfers mechanism is effective
- The social transfers (and pensions) have now an equalizing effect (0.0327 > 0.0138 > -0.01815)
- The labor share raised (0.5038 >0.5361 > 0.7443), but...

• It is more unequally distributed (0.5898 >0.6100)



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