# The joint distribution of income, consumption and wealth from a micro perspective 

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## Eurostat-OECD EG on joint distributions of Household Income, Consumption and Wealth

## Objective:

Produce joint distributions of household ICW at micro level
=> meso-level indicators of well-being, inequality and economic vulnerability

- reference year "around 2015"
- quality framework

Estimates produced for 36 countries.

[^0]| A | 1 | $€$ | 65,000 | € | 50,000 | $€$ | 100,000 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| A | 2 | € | 90,000 | € | 60,000 | $€$ | 900,000 |
| A | 3 | $€$ | 20,000 | $€$ | 20,000 |  | 0 |
| B | 1 | $€$ | 9,000 | $€$ | 11,000 | -€ | 20,000 |
| B | 2 | $€$ | 20,000 | € | 16,000 | $€$ | 200,000 |
| B | 3 | $€$ | 18,000 | $€$ | 16,000 |  | 0 |
| C | 1 | $€$ | 35,000 | $€$ | 28,000 |  | 0 |
| C | 2 | $€$ | 70,000 | $€$ | 40,000 | $€$ | 800,000 |
| C | 3 | $€$ | 40,000 | € | 32,000 | $€$ | 50,000 |

## Data sources and integration methods

Single source including information on the joint distribution of ICW rarely available.

- record linking of data from surveys or administrative registers $\rightarrow$ preferred option
- modules in existing surveys $\rightarrow$ second best option

Better integration in some national sources (e.g. France)
e.g. 'Over-indebtedness, consumption and wealth' (OCW) module of the EU-SILC survey 2017 - so far only used to
test and improve model assumptions for statistical matching


- statistical matching $\rightarrow$ main option for most countries, in particular to join consumption expenditure data


## Statistical matching

Target variables (Y, Z): annual household disposable income, annual household consumption expenditure, household net wealth

Matching variables ( X ): variables available in both datasets, that are coherent, comparable and having an explanatory power of the target;

Set of matching variables varies from country to country, mostly including household type or size, age of the reference person, etc.

Important: Use of income quantiles as a "hook" variable.
Matching method: mainly non-parametric hot deck

Integration of specific "target" variables from several independent data sources (referring to the same population), using common information as a link

Recipient dataset
Donor dataset


Matched dataset
 methods

Re-calibration of weights for some countries.

## Quality assessment, example IC

Matching variables
Household type, age class, tenure/rent, main source of income, income ventile interval

The statistical matching reproduces the original distribution of total consumption expenditure (HBS) very well in the joint IC dataset.

Original vs matched distributions


## Quality assessment, example IW

Matching variables
Food consumption quintile, household type, tenure status, gross income

The original distribution of net wealth (HFCS) is reproduced fairly well in the joint ICW dataset.

Original vs matched distributions


## Experimental results

Despite being able to reproduce original distributions fairly well in the joint ICW dataset, estimates based on the joint distribution are not to be classified as official statistics.

## Joint distribution of <br> Results <br> household disposable income and <br> household net wealth

|  |  | A Wealt | a | ntiles |  | CA |  |  |  |  |  |  | DE＊ |  |  |  |  |  | FR |  |  |  |  |  | JP |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1 | 2 | 3 | 4 | 5 |  | 1 | 2 | 3 | 4 | 5 |  |  | 1 | 2 | 3 | 4 | 5 | Wealth quintiles |  |  |  |  |  | Wealth quintile |  |  |  |  |  |
| $\stackrel{\text { e }}{ }$ | 6\％ | 3\％ | 3\％ | 5\％ | 3\％ |  | 11\％ | 4\％ | 2\％ | 2\％ | 2\％ |  | ${ }_{0} 1$ | 8\％ | 5\％ | 3\％ | 2\％ | 1\％ | ¢ 1 | 9\％ | 5\％ | 3\％ | 2\％ | 1\％ | ¢ | 6\％ | 5\％ | 4\％ | 3\％ | 2\％ |
| 红 2 | 6\％ | 4\％ | 3\％ | 4\％ | $3 \%$ |  | 5\％ | 5\％ | 4\％ | 3\％ | 2\％ | \％ | 를 2 | 5\％ | 5\％ | 5\％ | 3\％ | 2\％ | 者 2 | 6\％ | 5\％ | 4\％ | 3\％ | 1\％ |  | 5\％ | 4\％ | 4\％ | 4\％ | 3\％ |
| $\stackrel{0}{0}$ | 4\％ | 5\％ | 4\％ | 4\％ | 3\％ |  | 2\％ | 5\％ | 5\％ | 4\％ | 3\％ |  |  | 3\％ | 4\％ | 5\％ | 4\％ | 4\％ | 研 | 3\％ | 5\％ | 5\％ | 5\％ | 2\％ |  | 4\％ | 4\％ | 4\％ | 4\％ | 4\％ |
| $\stackrel{\text { ¢ }}{ }$ | 3\％ | 4\％ | 5\％ | 4\％ | $3 \%$ |  | 1\％ | 4\％ | 5\％ | 6\％ | \％4\％ |  |  | 2\％ | 3\％ | 5\％ | 5\％ | 5\％ |  | 2\％ | 4\％ | 5\％ | 6\％ | 4\％ |  | 3\％ | 4\％ | 4\％ | 4\％ | 4\％ |
|  | 1\％ | 3\％ | 4\％ | 4\％ | 7\％ |  | \％ | 2\％ | 4\％ | 5\％ | 9\％ |  |  | 1\％ | 2\％ | 3\％ | 5\％ | 9\％ |  | 0\％ | 2\％ | 3\％ | 4\％ | 1\％ |  | 2\％ | 3\％ | 4\％ | 5\％ | 7\％ |
| UK |  |  |  |  |  | us |  |  |  |  |  |  | CH |  |  |  |  |  | ES＊ |  |  |  |  |  | NL |  |  |  |  |  |
| Wealth quintiles |  |  |  |  |  | Wealth quintiles |  |  |  |  |  |  | Wealth quintiles |  |  |  |  |  | Wealth quintiles |  |  |  |  |  | Wealth quintiles |  |  |  |  |  |
|  | 1 | 2 | 3 | 4 | 5 |  | 1 | 2 | 3 | 4 | 4 | 5 |  |  | 2 | 3 | 4 | 5 |  | 1 | 2 | 3 | 4 | 5 |  | 1 | 2 | 3 | 4 | 5 |
|  | $18 \%$ | 4\％ | 3\％ | 3\％ | 2\％ |  | 9\％ | 6\％ | 3\％ | 1\％ | \％ 0 | 0\％ |  |  | 4\％ | \％3\％ | 3\％ | 3\％ |  | 18\％ | 5\％ | 3\％ | 1\％ | 2\％ |  | 5\％ | 9\％ | 3\％ | 2\％ | 2\％ |
| 등 2 | 2 6\％ | 5\％ | 4\％ | 4\％ | 2\％ |  | 2 5\％ | 6\％ | 5\％ | 3\％ | \％1 | 1\％ |  |  | \％5\％ | \％4\％ | 3\％ | $2 \%$ |  | 25 | 4\％ | 5\％ | 4\％ | 3\％ |  | $23 \%$ | 6\％ | 5\％ | 3\％ | 3\％ |
| $\stackrel{3}{5}$ | $33 \%$ | 5\％ | 4\％ | 4\％ | 4\％ |  | 3 3\％ | 5\％ | 5\％ | 5\％ | \％ | 2\％ |  |  | \％5\％ | 4\％ | 4\％ | 3\％ |  | 4\％ | 3\％ | 5\％ | 5\％ | $3 \%$ |  | 4\％ | 3\％ | 5\％ | 5\％ | 4\％ |
|  | $42 \%$ | 4\％ | 5\％ | 4\％ | 5\％ |  | $4{ }^{2 \%}$ |  | 6\％ | 6\％ | \％ 4 | 4\％ |  |  | 4\％ | \％5\％ | 5\％ | 4\％ |  | 4 3\％ | 3\％ | 4\％ | 5\％ |  |  | 5\％ | 1\％ | 4\％ | 5\％ | 5\％ |
|  | 5 1\％ | 2\％ | 4\％ | 5\％ | 8\％ |  | 5 0\％ | 0\％ | 2\％ | 4\％ | \％ 13 | 3\％ |  |  | \％2\％ | 4\％ | 5\％ | 8\％ |  | $51 \%$ | 2\％ | 2\％ | 4\％ |  |  | 4\％ | 1\％ | 3\％ | 5\％ | 7\％ |

Data source：National estimates complemented by Eurostat estimates for DE and ES．
$\underbrace{*+*}_{t}$ European
Commission

# Joint distribution of <br> Results 

AU
Consumption quintiles


Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| $\stackrel{\sim}{\sim} 1$ | 11\% | 5\% | 2\% | 1\% | 0\% |
| H | 5\% | 7\% | 5\% | 3\% | 0\% |
| \% 3 | 3\% | 5\% | 6\% | 5\% | 1\% |
| E 4 | 1\% | 2\% | 5\% | 7\% | 4\% |
| ¢ 5 | 0\% | 1\% | 1\% | 4\% | 14\% |
| CH |  |  |  |  |  |

Consumption quintiles

|  |  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1 | 10\% | 5\% | 3\% | 2\% | 1\% |
|  | 2 | 6\% | 6\% | 4\% | 3\% | 1\% |
|  | 3 | 3\% | 5\% | 5\% | 5\% | 2\% |
|  | 4 | 1\% | 3\% | 5\% | 6\% | 5\% |
|  | 5 | 1\% | 2\% | 3\% | 5\% | 10\% |

CA
Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 10\% | 5\% | 2\% | 1\% | 1\% |
|  | 7\% | 6\% | 4\% | 2\% | 1\% |
|  | 3\% | 6\% | 6\% | 5\% | 1\% |
|  | 1\% | 2\% | 6\% | 7\% | 5\% |
|  | 0\% | 1\% | 2\% | 5\% | 12\% |

Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 10\% | 6\% | 2\% | 1\% | 1\% |
|  | 6\% | 6\% | 4\% | 2\% | 1\% |
|  | 2\% | 5\% | 6\% | 4\% | 2\% |
|  | 1\% | 2\% | 6\% | 7\% | 4\% |
|  | 0\% | 0\% | 2\% | 6\% | 12\% |

ES*
Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 10\% | 5\% | 3\% | 1\% | 1\% |
|  | 6\% | 6\% | 4\% | , | 1\% |
|  | 3\% | 5\% | 5\% | \% | 3\% |
|  | 1\% | 3\% | 5\% | \% | 5\% |
|  | 1\% | 1\% | 3\% | 5\% | 0\% |

DE*
Consumption quintiles
 US

Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| ¢ 1 | 10\% | 5\% | 3\% | 1\% | 0\% |
| . 2 | 6\% | 5\% | 5\% | 3\% | 1\% |
| O 3 | 3\% | 5\% | 5\% | 5\% | 2\% |
| E 4 | 1\% | 3\% | 5\% | 6\% | 5\% |
| $\text { 드 } 5$ | 0\% | 1\% | 2\% | 5\% | 12\% |

Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| $\stackrel{\sim}{0} 1$ | 9\% | 5\% | 3\% | 2\% | 1\% |
| -들 2 | 6\% | 6\% | 4\% | 3\% | 1\% |
| ¢ 3 | 3\% | 5\% | 5\% | 4\% | 2\% |
| $\bigcirc$ | 2\% | 3\% | 5\% | 6\% | 5\% |
| $\subseteq 5$ | 1\% | 1\% | 2\% | 5\% | 11\% |

FR

Consumption quintiles

|  | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| ( 1 | 7\% | 4\% | 3\% | 3\% | 3\% |
| $\stackrel{\text { N }}{=} 2$ | 5\% | 4\% | 4\% | 4\% | 3\% |
| $0$ | 4\% | 4\% | 5\% | 4\% | 4\% |
| $\sum_{0}^{E} 4$ | 3\% | 5\% | 4\% | 4\% | 4\% |
| 드 5 | 2\% | 3\% | 4\% | 5\% | 6\% |

JP Consumption quintiles


Data source: National estimates complemented by Eurostat estimates for DE and ES.

Share of households in the top 20\% of

## Results

the joint distribution of income, consumption and wealth ICW

Share of households (\%) in the top 20\% of the joint ICW distribution, 'around 2015'

$3.5-7.5 \%$ of households belong to the top quintile of income, the top quintile of consumption \& the top quintile of wealth.

[^1]Share of resources held by the top 20\%

## Results

 of the joint distribution of income, consumption and wealth ICWShare of resources (\%) held by the top $\mathbf{2 0 \%}$ of the joint ICW distribution, 'around 2015'


8-34 \% of income and 13-54 \% of net wealth is hold by households in the top 20 of ICW.

[^2]Share of individuals who are both

## Results

 income and asset poorby activity status

## Share of individuals who are both income and asset poor (\%) by activity status, 'around 2015'



## Results

Share of dissaving households
by income poverty status


## Results

## Median saving rates

by income quintile

Median saving rates (\%) of the top and bottom income quintile, 'around 2015'


Bottom income quintile ■ Top income quintile - Total population

Median saving rates of the total population hide large differences between the top and bottom income quintile

[^3]Countries ordered by the difference of top to bottom quintile median saving rate.

## Conclusions

- Indicators based on joint ICW distributions are still experimental.
- Estimates produced by different countries are not fully comparable, due to differences in the methodology and source data.

Nevertheless:

- The two and three-dimensional indicators emphasise vulnerabilities hidden in unidimensional analyses
- Joint IC distributions enable the estimation of household savings.
- Joint ICW distributions can help in the assessment of tax burden of different household groups.


## 2020 wave

For countries of the Euro area, the reference year 2020 will be the first year, for which all data are collected together:


## Income

EU-SILC - Statistics on Income and Living Conditions, Incl. the Over-indebtedness, consumption \& wealth module

## Consumption expenditure

HBS - Household Budget Survey

## Wealth

HFCS - Household Finance and Consumption Survey

## THANK YOU


[^0]:    Australia, Canada, France, Germany, Japan, Mexico, UK, US Spain, Netherlands and Switzerland

[^1]:    * Eurostat estimates

[^2]:    * Eurostat estimates

[^3]:    * Eurostat estimates

