

# Beyond GDP and beyond Gini: the measurement of the inequality of opportunity

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# Inequality at center stage...

## ...but what inequality?

1. *Increasing "inequality"* as a major political debate in a number of countries
2. Two recent key surprise electoral results (Brexit, Trump election) broadly attributed to *"inequality"* (and globalization!)
3. What inequality are we talking about ?
  - France is a moderately unequal country, yet populism (left and right) are close to 50% of the votes, very much on an inequality platform

*Inequality cannot be reduced to the Gini coefficient of equivalized disposable income*

*Other dimensions of inequality are crucial: the inequality of opportunity (i.e., access to income generating facilities)*

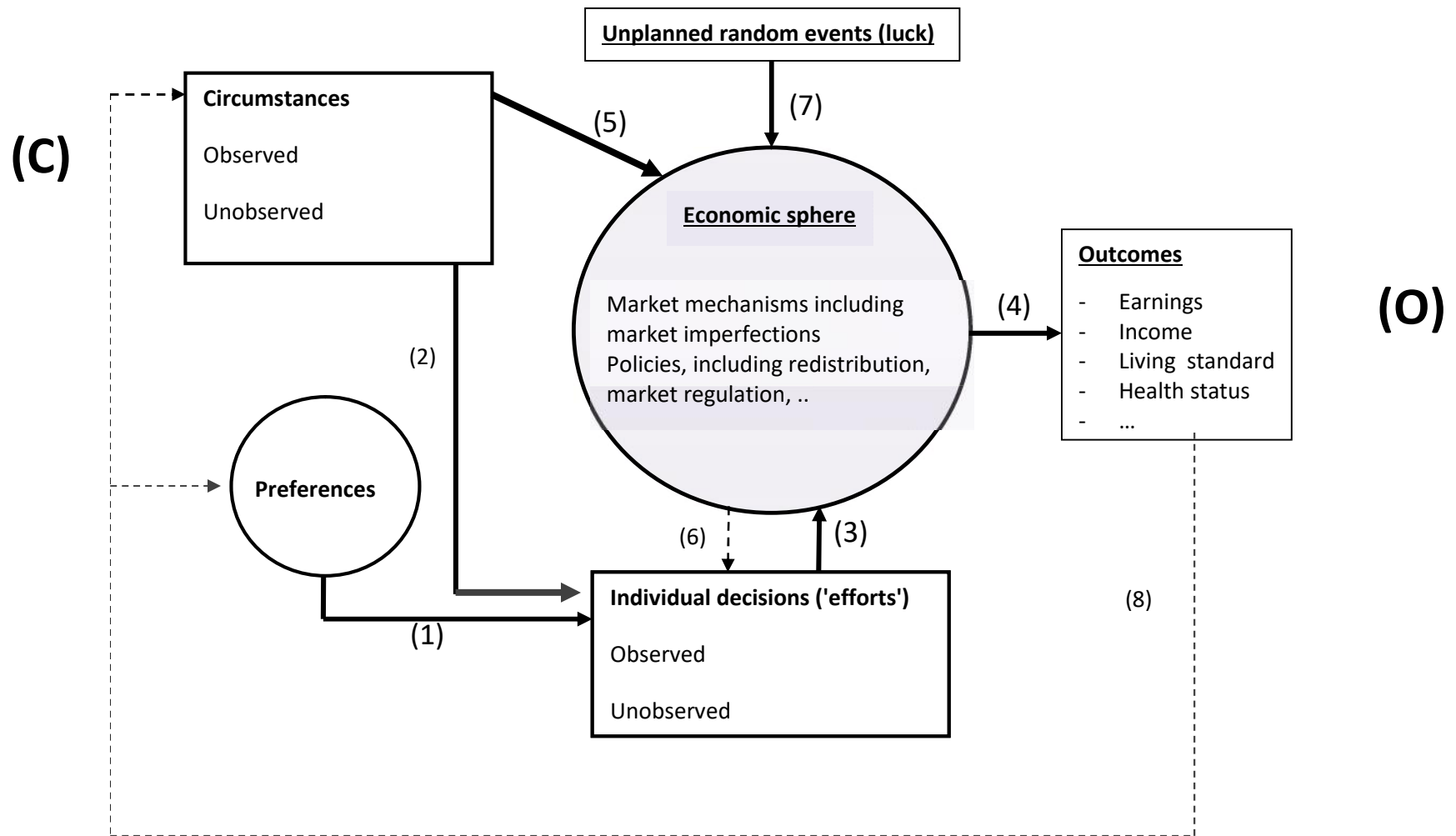
# The importance of the inequality of opportunity

- Inequality of opportunities ( $I_{opp}$ ) matters:
  - Per se (moral philosophy argument)
  - As a determinant of the inequality of outcomes
  - In a policy perspective
  - In a political perspective , through the perception people have of "inequality"
    - Example: the differentiated perception of social mobility: "Our children will not do as well as we did"
- Crucial to monitor the inequality of opportunity at the same time as that of outcomes
- How to monitor  $I_{opp}$ ? Measures and data requirements

# Outline

1. The relationship between 'opportunities' and 'outcomes'
2. Outcome-based measures of  $I_{opp}$ 
  - Non-parametric
    - Outcome means by type
    - Outcome distribution by type
    - Matrix representation
  - Parametric
    - Theoretical background
    - Intergenerational mobility elasticity (IGM)
    - Generalizing the IGM
    - Introducing cohort effects
3. Direct  $I_{opp}$  measures : the case of education
4. Conclusion

# 1. The relationship between individual circumstances, opportunities and outcomes



# The logics of $I_{opp}$ measurement

- $I_{opp}$  based on inequality of the distribution of circumstances, or some particular dimension of **(C)**
- $I_{opp}$  based on impact of the distribution of **(C)** on the distribution of a component of **(O)**
  - $I_{opp}$  depends on the set of circumstances in **(C)** and the component of **(O)** being considered
  - Inequality in **(O)** as a 'metric' of  $I_{opp}$

Note :  $I_{opp}$  will differ according to the component of (O) being considered (earnings, income, ... happiness)

## 2. Outcome-based measures of $I_{opp}$

### a) Non-parametric measures

i. Measure based on outcome *means* by 'types'

- 'Type' = individuals facing a given set of circumstances
- Example: *'female, born in rural area of region X, from uneducated but wealthy parents'*
- Define the virtual outcome distribution where all individuals with a given type get the mean outcome of that type:

Type	Mean outcome	Number of people
1	m1	n1
2	m2	n2
etc..		

## Measures based on outcome means by type

- *Absolute*  $I_{opp}$  = inequality measure of outcomes in the virtual distribution:

$$I_{opp} = I^0 = I(m_1: n_1 \text{ times}; m_2: n_2 \text{ times}; \dots; m_N: n_N \text{ times})$$

- Inequality measure  $I( )$  may be Gini, Theil, Log variance, ...
- *Relative* inequality of opportunity =  
Absolute inequality of opportunity,  $I^0$ /actual inequality of outcomes
- $I^0$  = Familiar *between group inequality component* of total outcome inequality in a partition of the population



## Examples

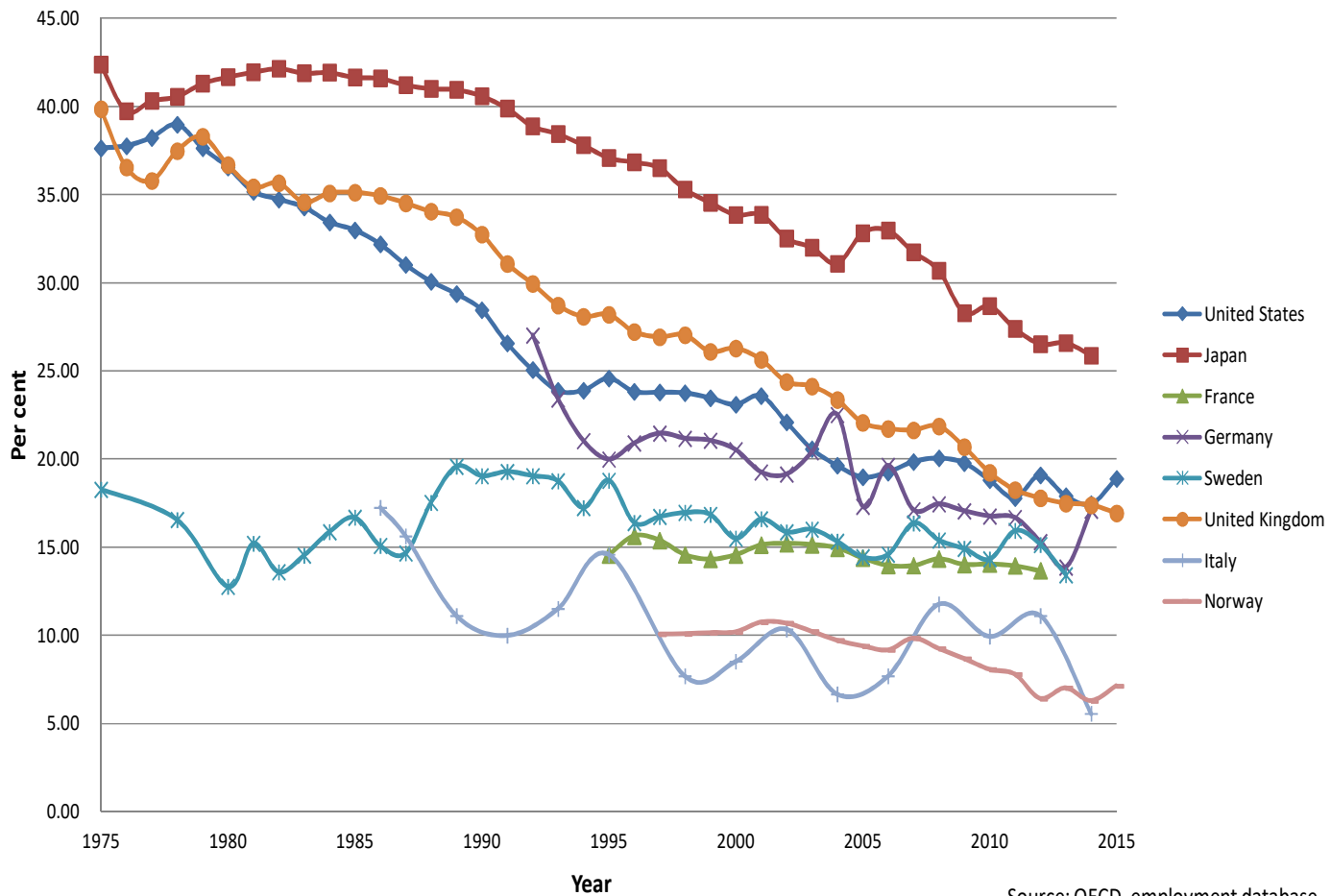
- Case of 2 types – i.e. gender
- Outcome = earnings

$I_{\text{opp}}$ :

- Absolute gap = Male mean earnings - Female mean earnings
- Relative gap = Absolute gap / male (female) earnings

**Figure 7. Gender wage gap in selected countries: 1975-2015**

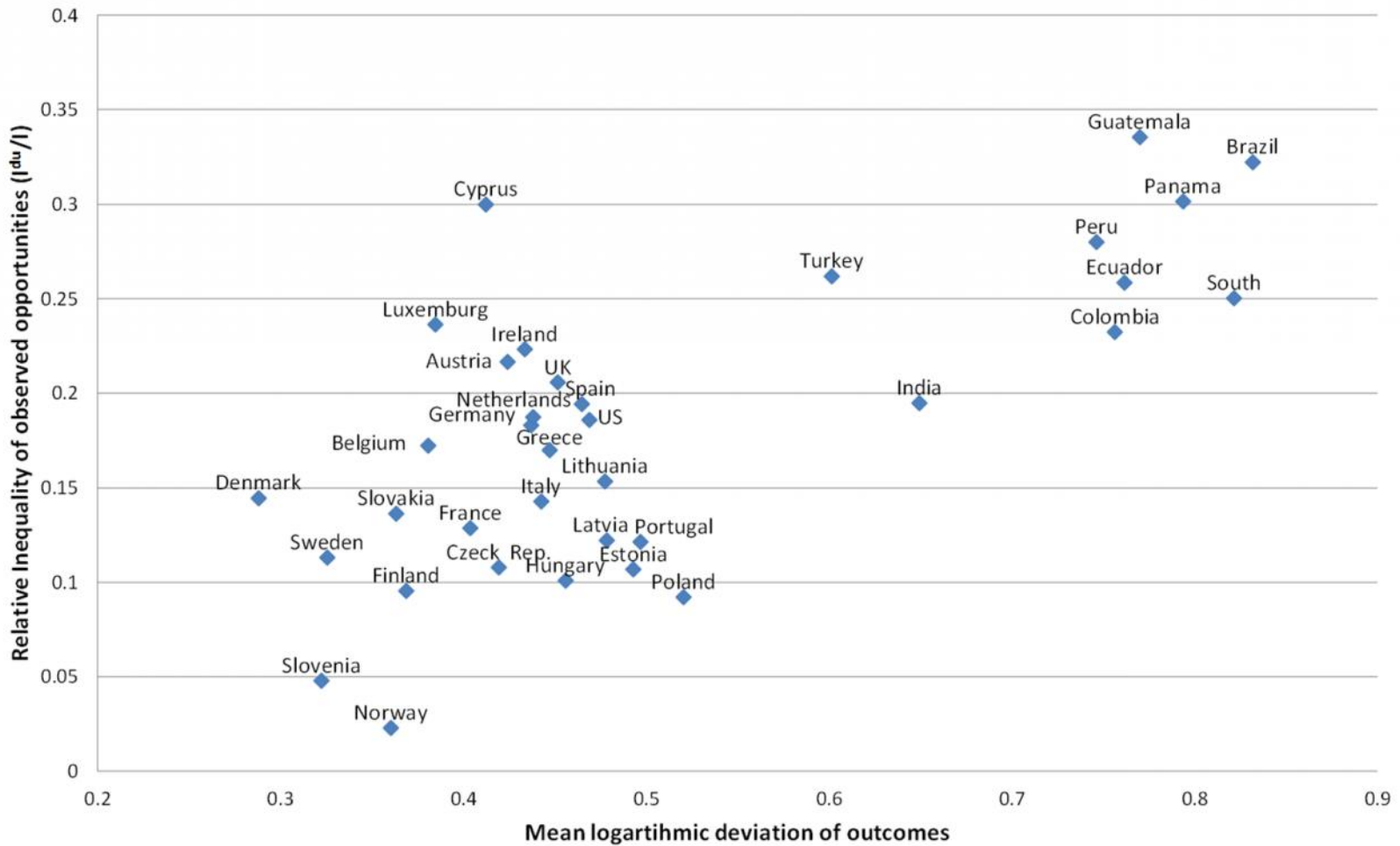
Percentage gap between median men and women earnings w.r.t. median mean earnings  
(full-time workers)



# Examples

- Types defined by: gender, education, region of birth, ...
- Outcome = earnings/household income per capita
- $I_{opp}$  Between type inequality, mean logarithmic deviation
- Various countries

**Figure 6. Inequality of outcomes and share due to observed dimensions of the inequality of opportunity: selected countries circa 2005  
(Inequality measure = Mean logarithmic deviation)**



## Non-parametric measures

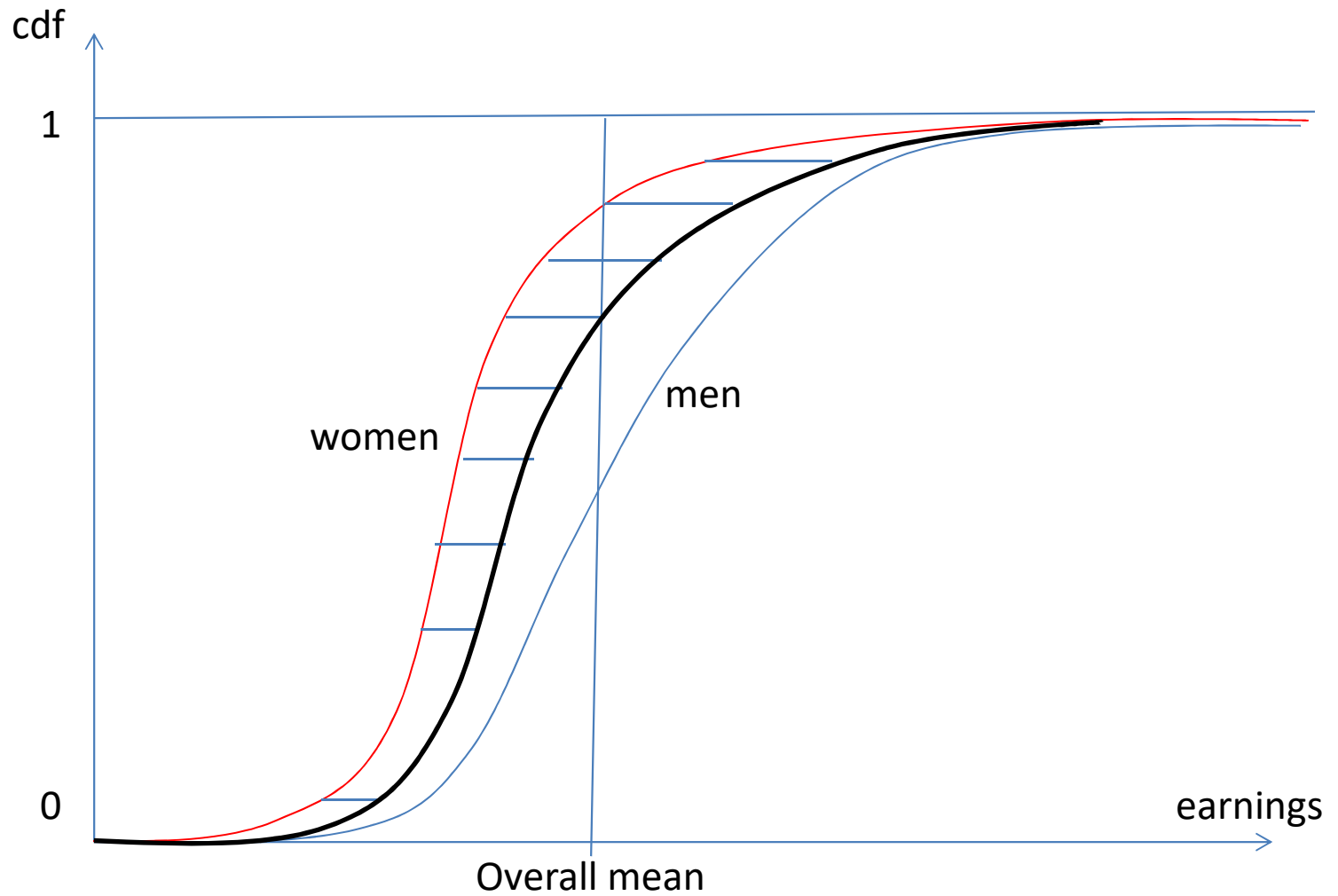
ii. Measure based on the outcome *distribution* by 'types'  
(Roemer)

- Instead of measuring difference in outcome means across types, compare outcome quantiles
- $I_{opp}$  based on aggregation of 'quantile gaps'
- Based on Roemer's criteria,  $I_{opp}$  could be defined as:

$$\int_0^1 [\bar{q}(f) - \text{Min}_t q_t(f)] df$$

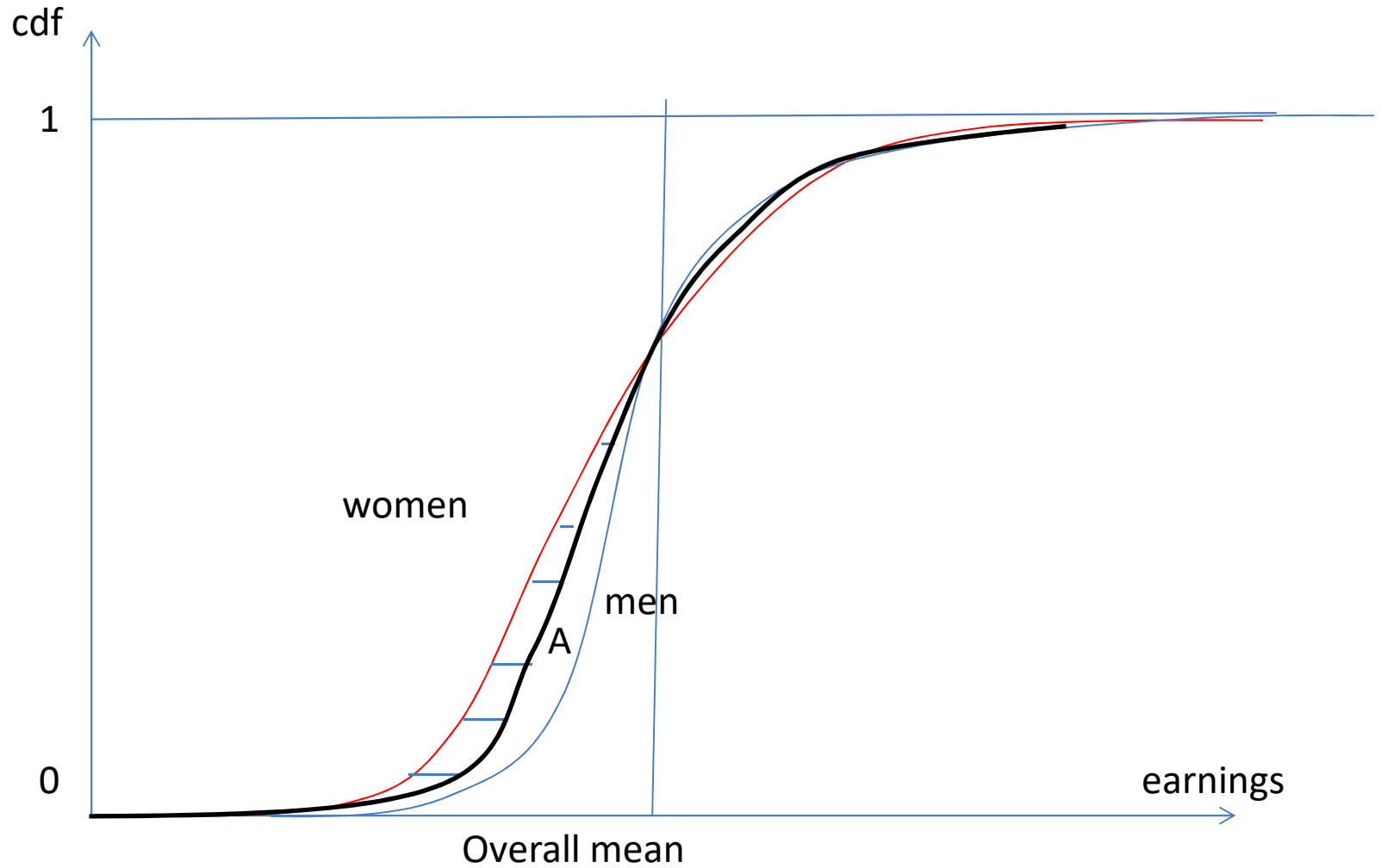
with  $q_t(\pi) =$  quantile of order  $\pi$  for type  $t$

Case of non-crossing cdf and two types:  
 $I_{opp} = \text{area between upper cdf and mean cdf}$



# Case of crossing cdf

$I_{opp}$  = area between envelope of cdf and mean cdf



# Non-parametric measures

## iii. Matrix representation

*Mostly used for inter( -intra) generational mobility*

- *'Types'* = brackets of parental income/earnings /education
- *Outcome* = brackets of present generation distribution of income/earnings/wealth
- $I_{opp}$  = measures based on the corresponding matrix (Huge literature on them + dominance criteria)



# Matrix representation of the distribution of opportunities (intergenerational mobility case)

Figure 3. Earnings intergenerational transition matrix (P)

Fathers \ Sons	$Y_1$	$Y_2$	$Y_3$	...	$Y_N$	Total
$Y_1$	$P_{11}$	$P_{12}$	$P_{13}$		$P_{1N}$	$P_{1.}$
$Y_2$	$P_{21}$	$P_{22}$	$P_{23}$		$P_{2N}$	$P_{2.}$
$Y_3$	$P_{31}$	$P_{32}$	$P_{33}$		$P_{3N}$	$P_{3.}$
...	...	...	...	...	...	...
$Y_N$	$P_{N1}$	$P_{N2}$	$P_{N3}$		$P_{NN}$	$P_{N.}$
Total	$P_{.1}$	$P_{.2}$	$P_{.3}$	...	$P_{.N}$	1

## b) Parametric measures

### i) Theoretical background

- Canonical model

$$y_i = f(C_i, e_i) + u_i \quad (1)$$

with C = 'circumstances', 'e' = efforts and u = unobserved circumstances and efforts

- Inequality of opportunity: direct unfairness

$$I^{O,du}(\tilde{e}) = I(\tilde{y}.); \quad \tilde{y}_i = f(C_i, \tilde{e}) + u_i \quad \text{close to } I^0 \text{ above}$$

- Inequality of opportunity : Fairness gap

$$I^{O,fg}(\tilde{C}) = I(y.) - I(y_i^{norm}(\tilde{C})); \quad y_i^{norm}(\tilde{C}) = f(\tilde{C}, e_i) + u_i$$

Close to  $R^2$  of OLS on (1) log-linear

Ambiguous status of 'residual' u

# Parametric measures

## ii) Intergenerational mobility, IGM

Model

$$\ln y_i = \alpha + \lambda \ln y_{iF} + u_i \quad y_{iF} = \text{income of father}$$

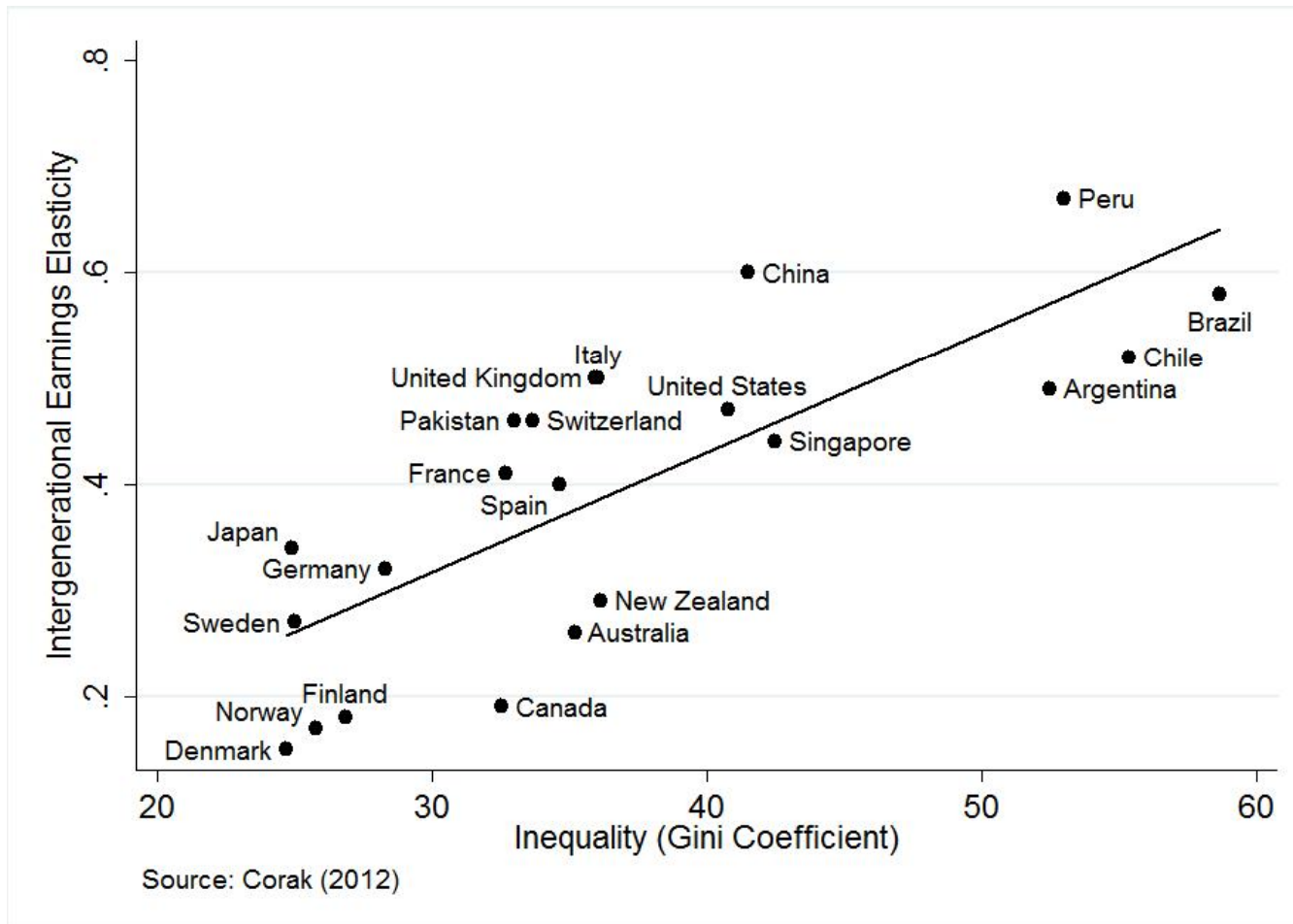
IGE = intergenerational elasticity =  $\hat{\lambda}$

$$I^{o,fg} = R^2 = \hat{\lambda} \cdot \frac{\text{Var}(\hat{y})}{\text{Var}(y_F)}$$

$I_{\text{opp}}$  = IGE if the variance of the (log) earnings does not change across generations

*But, why considering the earnings of parents as the only circumstance affecting the earnings of children?*

# Illustration: the Great Gasby curve



# Parametric measures

## iii) Generalizing the IGM model

$$\text{Ln } y_i = S \cdot Z_i + u_i \quad (2)$$

where  $Z$  = all circumstances to be taken into account:

$$I^{o,fg} = R^2$$

Or:

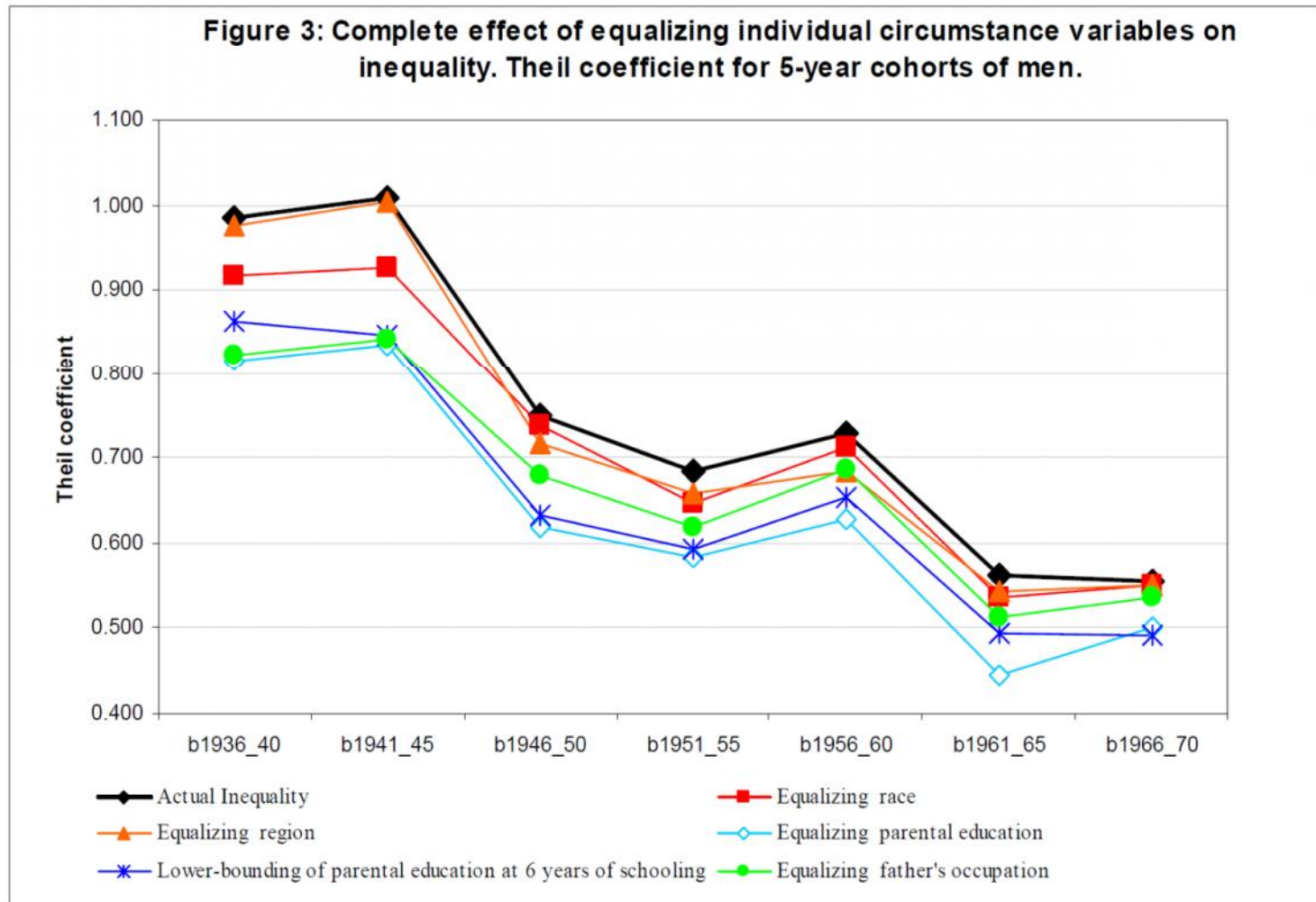
$$I^{O,fg} = I(y_i) - I(y_i^{norm}(\bar{Z})); \quad \text{Log } y_i^{norm}(\bar{Z}) = S \cdot \bar{Z} + u_i$$

$$I^{O,du} = I(\tilde{y}_i); \quad \text{Log } \tilde{y}_i = S \cdot Z_i$$

Note: Model (2) identical to model (1) (IGM) when  $y_{iF}$  is instrumented by  $Z$  (as in Aronsson and Mazumder, 2008)

Example: See Brunori, Ferreira, Peragine (2013)

# Generalized IGM and cohort analysis



From Bourguignon, Ferreira, Menendez (2007)

# Cohort analysis

- Distinguishing cohorts in regression analysis is essential as inequality of opportunities are likely to be age/cohort dependent
- Estimating model (2) at regular time intervals should allow to monitor  $I_{opp}$  over time.

# A remark on gender gap

General model (2)

$$\ln y_i = \alpha .G_i + \beta .Z_i + u_i$$

with G = gender dummy (1 = male; 0 = female) and Z = personal characteristics (education, parental background, ...)

**$\alpha$  = Residual gap** (once full gap corrected for gender differences in Z) and differs from 'total wage gap'

Yet, it is the total gap that matters (if focusing on gender)

Note: to what extent should Z include variables like working time or job experience ?



**Figure 8. Gender wage gap and residual wage gap in a meta-analysis of the wage gap decomposition literature**  
 Source: Weichselbaumer and Winter-Ebmer (2005)

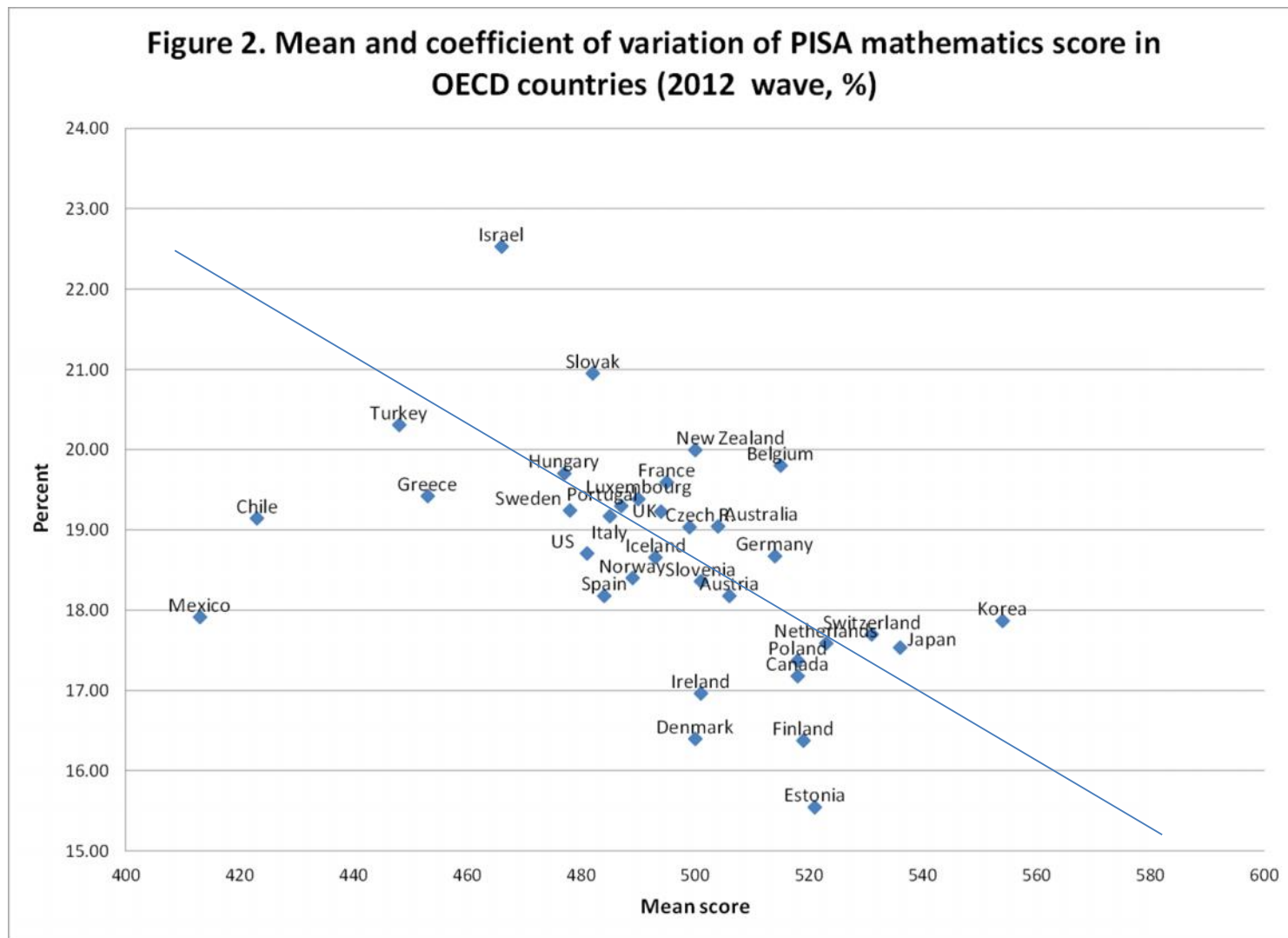


### 3) Direct measure of the inequality of opportunity

$$y = f(C,e) + u$$

- Measure directly the inequality of opportunity on C rather than through the effect of C on y
- Case of *educational achievement*: inequality measured by inequality of test scores PISA types
- Question: weight of that component of C in y? (less than 5% in Murnane, 2000)
- Educational as a circumstance or an outcome, explained by other circumstances

# Inequality of Pisa scores



## 4. Conclusions

- Monitoring of the inequality of outcome (income, earning, wealth) *needs to be complemented* by that of opportunity
- Monitoring the inequality of opportunity = *monitoring of SOME observed circumstances* and/or their effect on the inequality of outcomes
- Even though a lower bound of the actual inequality of opportunity – which cannot be evaluated anyhow- monitoring it would respond to strong social demand
- Social mobility (IGM) as only one of components of the  $I_{opp}$  although possibly an important one

# Priority statistics to monitor the inequality of opportunity

- The inequality of economic outcomes (earnings, income) arising from parental background and its share in total inequality of outcome.
- Variance analysis of scores in PISA and possibly surveys at younger ages
- (Gender (ethnic) inequality in employment and earnings)

THANK YOU