### Request that you should not refuse

- PLEASE SWITCH OFF AND PUT AWAY YOUR CELL PHONES
- LAPTOPS OK IF WORK IS ACADEMIC
- REMOVE BAGS AND OTHER MATERIALS THAT CAN CAUSE DISTRACTION
- STOP HAVING SIDE CONVERSATIONS
- PARTICIPATE IN CLASS

### Class 13

Returns to Education, Inequality, Discrimination PS 2 Questions - Posted – Turn it in on Wed May 24

Read for Wednesday's Class (Class 14)

Work on selecting a Literature for final project

Returns to Education and Inequality Paper

### For upcoming Weekend

Bertrand and Mullianathan Paper, Domestic Violence
Paper

# Visual Demonstration of the Solution: IV/Natural Experiment (DiD)/RD/:

IV: Strong / Weak

$$cov(z_i, x_i) \neq 0$$

IV: Valid / Invalid  $cov(z_i, u_i) = 0$ 

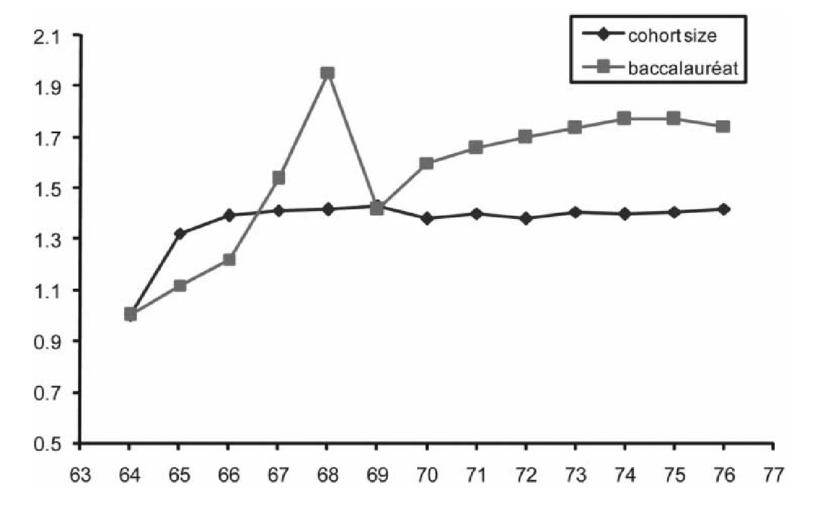


Fig. 1.—Trends in the number of *bacheliers* and in cohort size. The size of the cohort for year t corresponds to the number of persons born at t-19 (19 is the median age of candidates). The two series are normalized to one in 1945. Source: French Ministry of Education (number of *bacheliers*) and the French Statistical Office (cohort size).

Table 2
Distribution of Education across Male Workers, by Year of Birth (%)

|      |                          | Greater than Baccalauréat |                               |                         |  |
|------|--------------------------|---------------------------|-------------------------------|-------------------------|--|
|      | Baccalauréat Only<br>(1) | All (2)                   | Diploma ( <i>Bac</i> + 2) (3) | Degree+ (> Bac + 2) (4) |  |
| 1946 | 9.9 (.4)                 | 17.4 (.6)                 | 6.3 (.3)                      | 11.0 (.5)               |  |
| 1947 | 9.0 (.4)                 | 18.8 (.6)                 | 7.1 (.4)                      | 11.8 (.5)               |  |
| 1948 | 9.1 (.4)                 | 19.0 (.6)                 | 6.9 (.4)                      | 12.1 (.5)               |  |
| 1949 | 9.8 (.4)                 | 20.3 (.6)                 | 8.6 (.4)                      | 11.6 (.5)               |  |
| 1950 | 9.8 (.4)                 | 18.4 (.6)                 | 8.0 (.4)                      | 10.4 (.5)               |  |
| 1951 | 9.8 (.4)                 | 17.9 (.6)                 | 7.5 (.4)                      | 10.4 (.5)               |  |
| 1952 | 9.8 (.4)                 | 17.8 (.6)                 | 7.3 (.4)                      | 10.4 (.5)               |  |

Source.—Labor Force Survey 1990, 1993, 1996, and 1999.

Note.—Sample is male wage earners. Standard deviation is in parentheses.

### **Equations/ Empirical Strategy**

We write the labor market outcomes  $(w_i)$  of worker i from cohort  $c_i$  at age  $a_i$  as follows:

$$w_i = \alpha n_i + \beta a_i + \gamma c_i + u_i, \tag{1}$$

where  $n_i$  represents years of education and  $u_i$  represents unobserved determinants of wages (such as ability). In what follows,  $w_i$  will represent either the wage earned or occupational status of i.

$$n_i = d_{47}C_{i47} + d_{48}C_{i48} + d_{49}C_{i49} + d_{50}C_{i50} + d_{51}C_{51} + \theta c_i + v_i,$$
 (2)

$$w_i = \alpha n_i + \beta a_i + d_{c_i} + e_{f_i} + u_i, \qquad (3)$$

Table 4
Impact of Birth Cohort on the Education and Labor Market Outcomes of Male Workers

|       | Baccalauréat<br>Only<br>(1) | At Least<br>University<br>Diploma<br>(Bac + 2 or<br>More)<br>(2) | At Least<br>University<br>Degree<br>(Bac + 3)<br>(3) | Years of<br>Higher<br>Education<br>(4) | Log Wage<br>(5) | Cadre (Up-<br>per-White-<br>Collar<br>Occupation)<br>(6) |
|-------|-----------------------------|--|--|--|-----------------|--|
| 1947  | 009 (.006)                  | .014 (.008)  | .008 (.006)  | .060 (.050)                            | .006 (.010)     | .001 (.008)  |
| 1948  | .007 (.006)                 | .015 (.008)  | .012 (.006)  | .080 (.050)                            | .031 (.010)     | .008 (.008)  |
| 1949  | 001(.006)                   | .027 (.008)  | .009 (.006)  | .150 (.050)                            | .021 (.010)     | .016 (.008)  |
| 1950  | 001(.006)                   | (800.) 800.  | 002(.006)  | .030 (.050)                            | .005 (.010)     | .000 (.008)  |
| 1951  | 005(.006)                   | .002 (.008)  | 001(.006)  | .010 (.050)                            | .003 (.010)     | .003 (.008)  |
| Trend | 000(.001)                   | .001 (.008)  | 001 (.001)   | .005 (.010)                            | .010 (.002)     | 005(.001)  |
| Age   | 000(.001)                   | .001 (.008)  | .000 (.001)  | .004 (.005)                            | .023 (.001)     | .003 (.001)  |
| N     | 26,370                      | 26,370   | 26,370   | 26,370                                 | 26,370          | 26,370   |

Source. - Labor Force Survey 1990, 1993, 1996, and 1999.

Note.—Sample is male wage earners born between 1946 and 1952. Coefficients for the worker's cohort dummy are relative to the comparison cohorts of 1946 and 1952. Standard deviation is in parentheses.

Table 5
Evaluation of the Return to Education Using 1949 as an Instrumental Variable

|   | Log  | Wage  | Upper-Wh<br>Occupation  | nite-Collar<br>on ( <i>Cadre</i> )                       |
|---|--|---|---|--|
|   | OLS (1)  | IV<br>(2)   | OLS<br>(3)  | IV<br>(4)  |
| Years of higher education<br>Cohort trend<br>Age<br>N<br>R <sup>2</sup> | .0940 (.0020)<br>.0100 (.0020)<br>.0230 (.0010)<br>11,171<br>.25 | .1400 (.0600)<br>.0100 (.0200)<br>.0230 (.0020)<br>11,171 | .0970 (.0010)<br>0056 (.0015)<br>.0034 (.0009)<br>11,171<br>.36 | .1030 (.0410)<br>0057 (.0017)<br>.0033 (.0011)<br>11,171 |

Source.—Labor Force Survey 1990, 1993, 1996, and 1999.

Note.—OLS = ordinary least squares; IV = instrumental variable. Sample is male wage earners born in 1946, 1949, or 1952. Standard deviation is in parentheses.

# The Wage Distribution in the United States, 2012

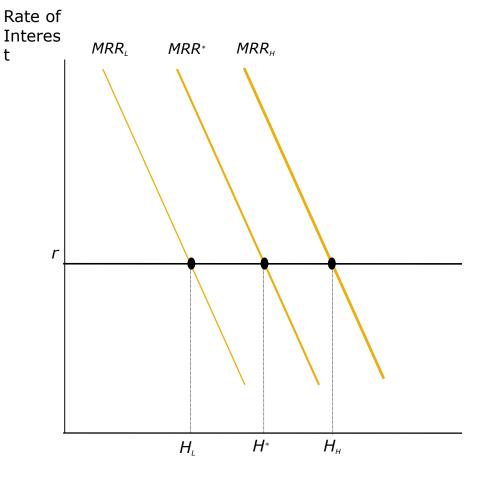


| Country               | Share of Total<br>Income<br>Bottom 10% | Share of Total<br>Income Top<br>10% |
|-----------------------|--|-------------------------------------|
| Australia             | 2                                      | 25                                  |
| Austria               | 3                                      | 23                                  |
| Belgium               | 3                                      | 28                                  |
| Canada                | 3                                      | 25                                  |
| Chile                 | 2                                      | 42                                  |
| Dominical<br>Republic | 2                                      | 38                                  |
| France                | 3                                      | 25                                  |
| Germany               | 3                                      | 22                                  |
| Guetemala             | 1                                      | 43                                  |
| Hungary               | 4                                      | 24                                  |
| India                 | 4                                      | 31                                  |
| Israel                | 2                                      | 29                                  |
| Italy                 | 2                                      | 27                                  |
| Mexico                | 1                                      | 41                                  |
| Norway                | 4                                      | 23                                  |
| Sweden                | 4                                      | 22                                  |
| UK                    | 2                                      | 29                                  |
| USA                   | 2                                      | 30                                  |

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### Facts About the Earnings Distribution

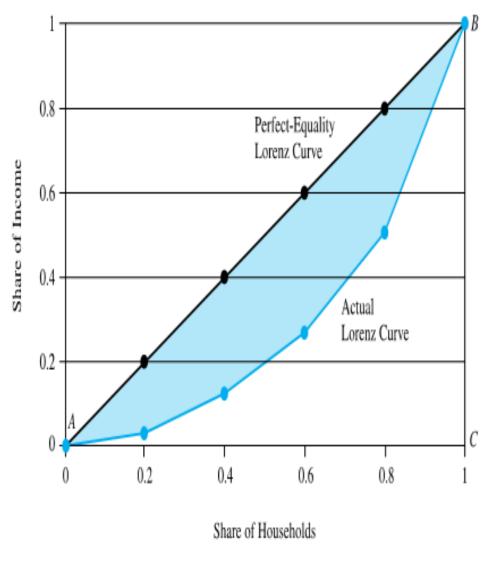
- Wage differentials exist due to:
  - Human capital investments that vary from worker to worker.
  - Age differences. (Young workers are still accumulating human capital, while older workers are collecting returns from earlier investments.)
- There is a positive correlation between ability and human capital investments, which "stretches out" wages in the population.



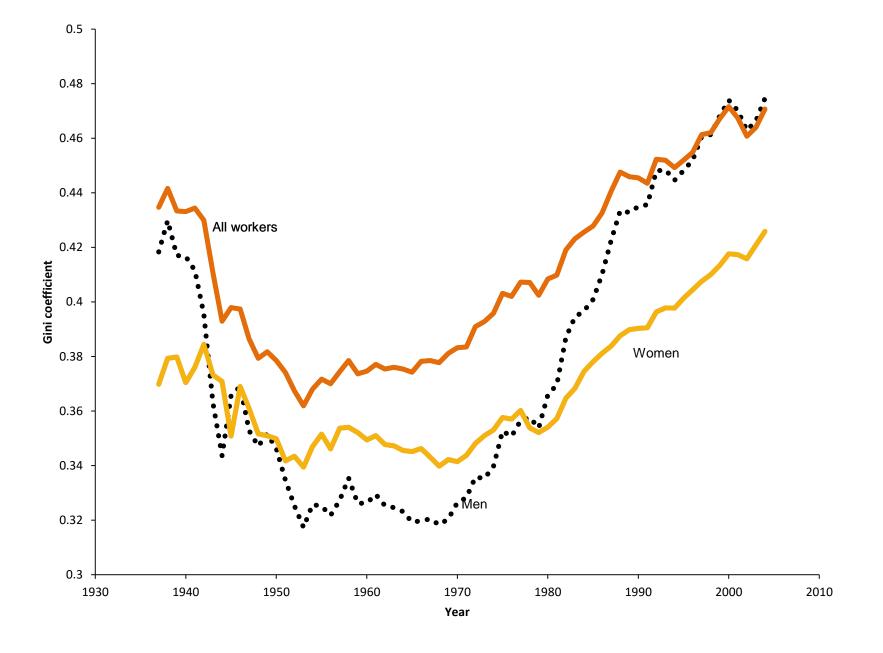
$$Gini = \frac{Shaded\ Area}{Area\ \Delta ABC}$$

Shaded Area  $\uparrow \Rightarrow$  Gini  $\uparrow \Rightarrow$  Inequality  $\uparrow$ Shaded Area  $\downarrow \Rightarrow$  Gini  $\downarrow \Rightarrow$  Inequality  $\downarrow$ 

| Quintile | Share of Income | Cumulative<br>Share of<br>Income |
|----------|-----------------|----------------------------------|
| First    | .034            | .034                             |
| Second   | .086            | .120=.03<br>4+.086               |
| Third    | .147            | .267=.12<br>0+.147               |
| Fourth   | .233            | .500                             |
| Fifth    | .500            | 1.00                             |

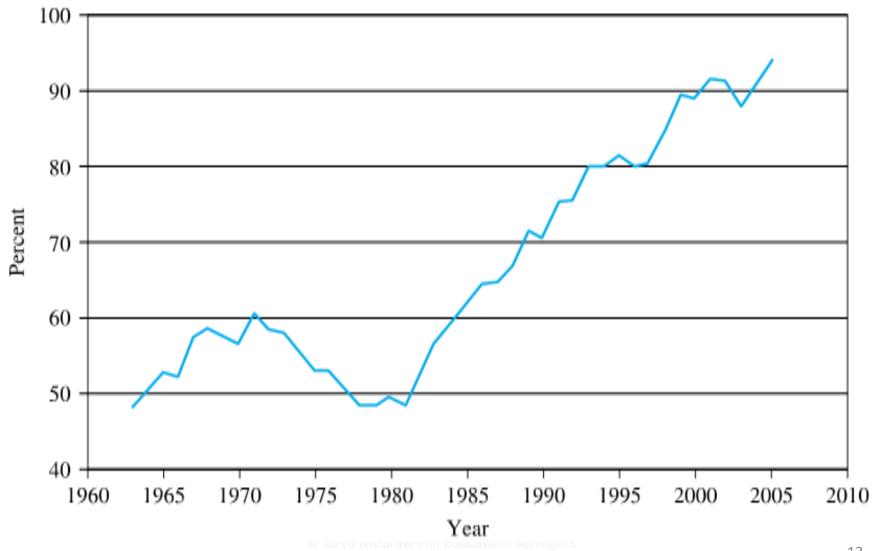


Subhra B. Saha 11



### **Skill Premium**

$$35 \times 52 \times 25 = 45.5K$$
  $35 \times 52 \times 50 = 91K$ 



Reserved.

13

16.8%

16.6

17.0

17.3

20.4

13.6

9.9

9.8%

8.8

10.8

10.6

9.7

7.1

7.2

20.1%

20.0

20.2

22.3

14.2

10.7

30.9

11.6%

12.0

11.2

12.9

7.8

4.3

23.0

| Educational Distribution by Race |           |        |         |           |            |          |
|----------------------------------|-----------|--------|---------|-----------|------------|----------|
| Group                            | Less than | High   | Some    | Associate | Bachelor's | Advanced |
| Gloup                            | High      | School | College | Degree    | Degree     | Degree   |
|                                  |           |        |         |           |            |          |
|                                  |           |        |         |           |            |          |

31.1

31.6

30.6

30.6

35.9

33.2

20.4

%

10.6%

11

10.2

6.3

12.0

31.0

8.7

All Persons

Male

**Female** 

White

Black

Asian

Hispanic

### Why Did Wage Inequality Increase? & Super Star Effect

- Supply shifts (more for low skill relative to high skill workers).
- International trade (manufacturing, outsourcing).
- Skill-based technological change. (higher demand for high skill workers)
- Piketty
- Institutional changes in the U.S. labor market.
  - Unions
  - Minimum Wage

| Rank | Name                   | 2010 Income |
|------|------------------------|-------------|
| 1    | Oprah Winfrey          | 315         |
| 2    | James Cameron          | 210         |
| 3    | U2                     | 130         |
| 4    | Tyler Perry            | 125         |
| 5    | Michael Bay            | 120         |
| 6    | AC/DC                  | 114         |
| 7    | Tiger Woods            | 105         |
| 8    | Steven Spielberg       | 100         |
| 8    | Jerry<br>Bruckheimer   | 100         |
| 10   | George Lucas           | 95          |
| 11   | <b>Beyonce Knowles</b> | 87          |
| 12   | Simon Cowell           | 80          |
| 12   | Dr. Phil McGraw        | 80          |
| 14   | Jonny Depp             | 75          |
| 14   | Jerry Seinfeld         | 75          |
|      |                        |             |

 You must be super skilled & your skills should have a large market

### Inequality Across Generations

- There is a positive correlation between the skills of parents and their children.
- High-income parents typically invest more in the education of their children than do lowincome parents.
- There is a tendency for income differences across families to get smaller over time ("regression toward the mean").

- Rich kids do well in school (relative to poor kids) and are more productive - they earn more. Intergenerational Inequality increases
  - Rich parents give their kids richer endowments (relative to what poor parents can give their kids) even with no schooling (or similar schooling) for either group; Intergenerational Inequality increases.
- Correlation between kids and parents income between 20% & 40%

Figure 1
The Great Gatsby Curve: More Inequality is Associated with Less Mobility across the Generations

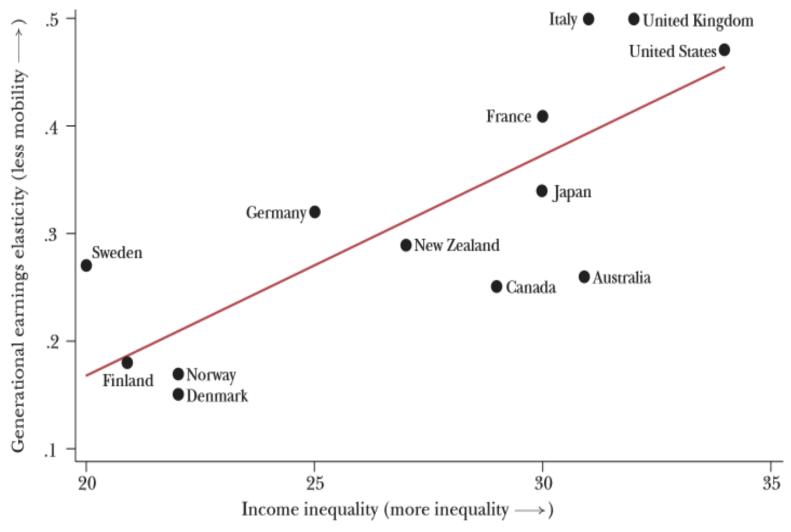
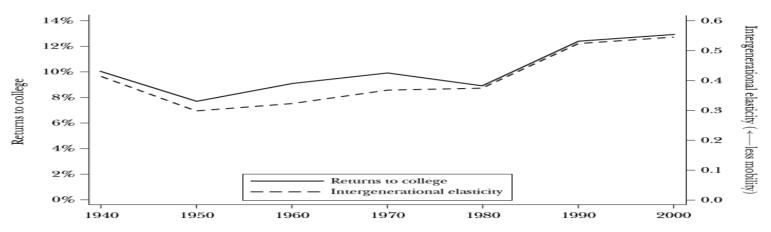


Figure 5
The Higher the Return to College, the Lower the Degree of Intergenerational Mobility: United States, 1940 to 2000



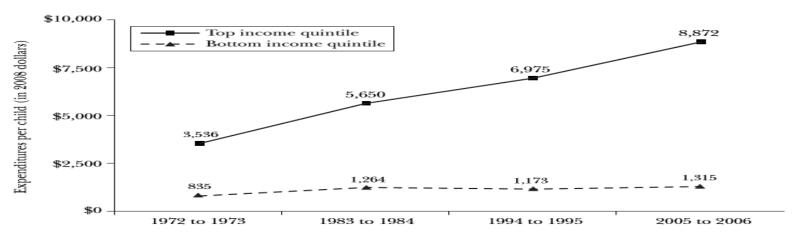
Source: Adapted by the author from Mazumder (2012, Figure 1).

Notes: Information on the returns to college and the intergenerational expression of the college and the intergeneration of the college and the college and the college and the intergeneration of the college and the college

capabilities of their children.

Notes: Information on the returns to college and the intergenerational earnings elasticity were provided to the author by Bhashkar Mazumder. As reported in Mazumder (2012), these are respectively from Goldin and Katz (1999) and Aaronson and Mazumder (2008, table 1 column 2). The 1940 estimate of the elasticity is a projection using Aaronson and Mazumder (2008, table 2 column 2).

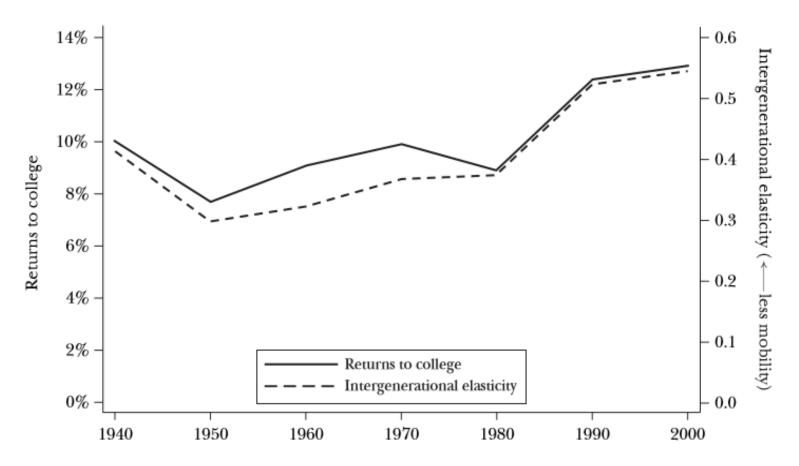
Figure 6
Money Matters: Higher-Income Families in the United States Have Higher
Enrichment Expenditures on Their Children



Source: Duncan, Greg J. and Richard J. Murnane. Figure 1.6 "Enrichment Expenditures on Children, 1972–2006." In Whither Opportunity, edited by Greg J. Duncan and Richard J. Murnane, © 2011 Russell Sage Foundation, 112 East 64th Street, New York, NY 10065. Reprinted with permission.

Note: "Enrichment expenditures" refers to the amount of money families spend per child on books, computers, high-quality child care, summer camps, private schooling, and other things that promote the

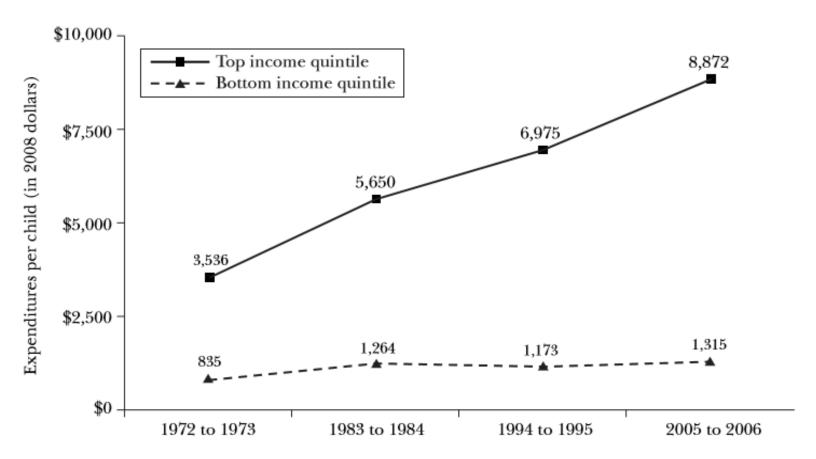
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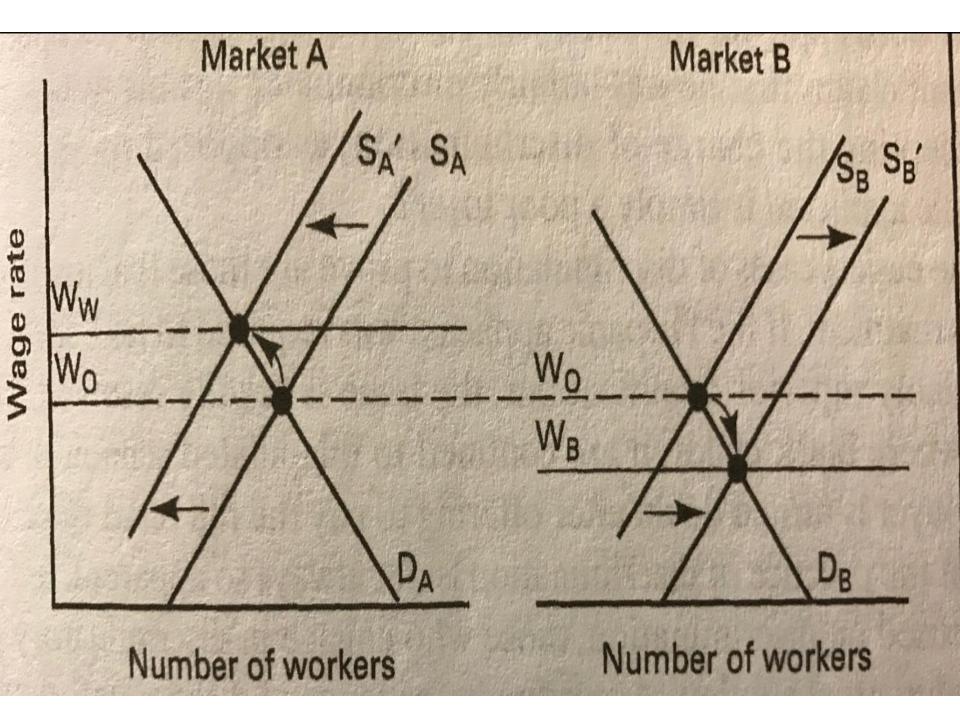
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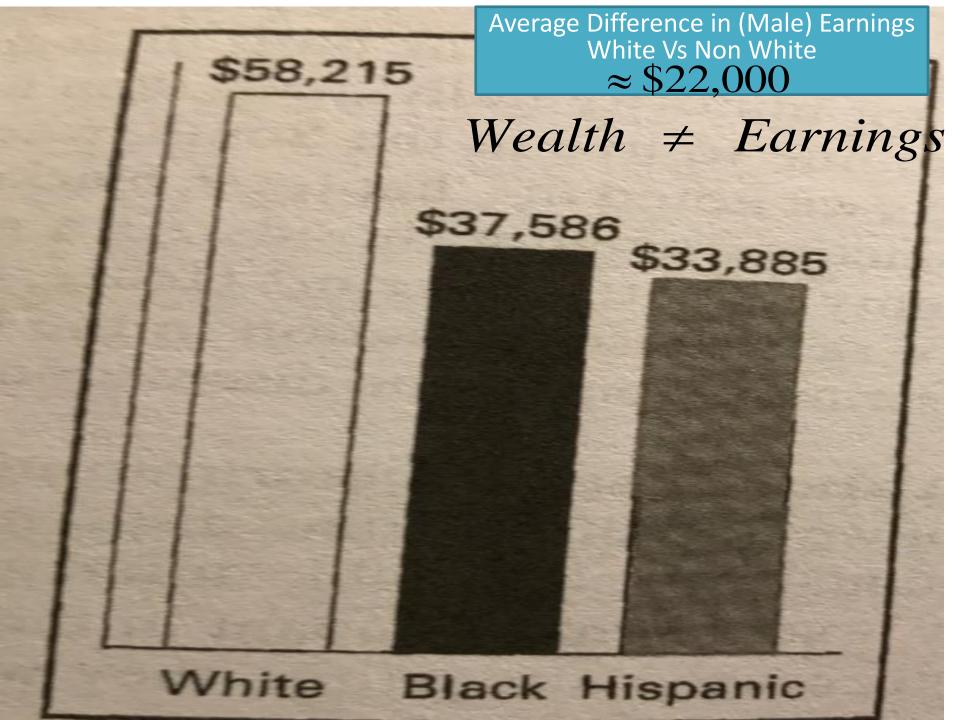
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### Raw differences are larger than adjusted differences

| IADLL IC.                                       |                                      | Earnings as Percent of White Average, for |                  |  |
|---|--------------------------------------|---|------------------|--|
|   | Average Earnings<br>of White Workers | Black Workers                             | Hispanic Workers |  |
| Education                                       |                                      | 67.5                                      | 78.6             |  |
| High school dropout                             | \$31,451                             | 73.3                                      | 78.4             |  |
| High school graduate                            | \$40,893                             | 76.3                                      | 77.0             |  |
|   | \$48,015                             | 72.5                                      | 76.6             |  |
| Some college                                    | \$73,198                             |   |                  |  |
| College graduate  Source: U.S. Bureau of the Ce | for males 2                          | 5 years old and older).                   |                  |  |

Wanneth Couch

| TABLE 12.2 Unemployment of Male V        | Whites | Blacks | Hispanics |
|--|--------|--------|-----------|
| Unemployment rate (percent)              | 4.4    | 10.5   | 5.4       |
| Average duration of unemployment (weeks) | 17.6   | 22.6   | 16.0      |

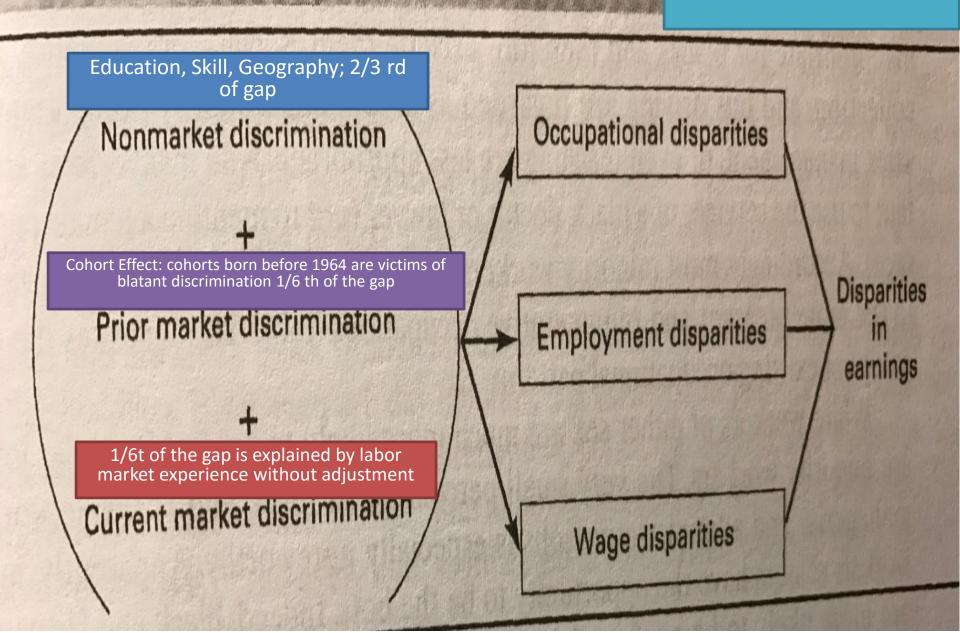
Non White: Less Educated, Less Experienced, Hired Last, Fired Fast, Unequal Training Opportunities

Often Non Whites in the most menial jobs in an organization – factors other than discrimination responsible for this:

NETWORKING, BARGAINING

FIGURE 12.3 The Sources of Earnings Disparities

Proportions May NOT be fixed across time



### Employer Discrimination Employee Discrimination

**Consumer Discrimination** 

Statistical Discrimination: Asymmetric Information about worker quality

#### Measuring Discrimination: Oaxaca Decomposition

- Difference in Average wages = Average Wages of Majority (Male) – Average Wages of Minority (Female)
- Difference in Average wages = Discrimination + Skill Difference

$$\Delta \overline{w} = \overline{w}_M - \overline{w}_F \quad \overline{w}_M = \alpha_M + \beta_M \overline{s}_M \quad \overline{w}_F = \alpha_F + \beta_F \overline{s}_F$$

$$\Delta w = \overline{w}_M - \overline{w}_F = (\alpha_M - \alpha_F) + \beta_M \overline{s}_M - \beta_F \overline{s}_F$$

$$\Delta w = (\alpha_M - \alpha_F) + \beta_M \overline{s}_M - \beta_F \overline{s}_F - \beta_M \overline{s}_F + \beta_M \overline{s}_F$$

$$\Delta w = (\alpha_M - \alpha_F) + (\beta_M - \beta_F) \overline{s}_F + \beta_M (\overline{s}_M - \overline{s}_F)$$

# The Oaxaca Decomposition of the Black-White Wage Differential, 1995

|                              | Controls for Differences in<br>Education, Age, Sex, and<br>Region of Residence | Controls for Differences in<br>Education, Age, Sex,<br>Region, and Occupation<br>and Industry |
|------------------------------|--|---|
| Raw log wage differential    | -0.211   | -0.211  |
| Due to differences in skills | -0.082   | -0.144  |
| Due to discrimination        | -0.134   | -0.098  |

Source: Joseph G. Altonji and Rebecca M. Blank, "Race and Gender in the Labor Market," in Orley Ashenfelter and David Card, editors, *Handbook of Labor Economics*, *vol. 3C*, Amsterdam: Elsevier, 1999, Table 5. The log wage differential between any two groups can be interpreted as being approximately equal to the percentage wage differential between the groups.