## A BlinderOaxaca Decomposition of the Canadian White-Aboriginal Wage Gap

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November
29th, 2021

## Background

- Aboriginals are indigenous peoples of Canada
- First Nations
- Métis
- Inuit*
- Total $4.9 \%$ of the population ( 1.67 million people)
- European Settlement and the "Indian Problem"
- Indigenous not considered citizens until 1951
- Residential schools


## Explanation of Dataset

- Cross-sectional subset of 2016 Canadian Census PUMFs
- 96,973 observations
- 3,757 aboriginals
- Large dataset useful, and necessary to have a sufficient number of aboriginals
- Only includes:
- Whites and aboriginals (non-Inuit)
- Non-immigrants
- Holds a job
- Does not live in territories
- Age 20 to 64 years


## Issue at Hand

- How does "aboriginality" contribute to patterns of wage disparities?
- How much are aboriginals disadvantaged when compared to the majority white population?
- Does schooling allow Aboriginal workers to overcome earnings disparity?

Table 2. Median income by group.

| Group | Median income | Obs. | Group | Median income | Obs. |
| :--- | :--- | :--- | :--- | :--- | :--- |
| White Male | $\$ 59,000$ | 48,957 | White Female | $\$ 39,000$ | 43,586 |
| Male | $\$ 59,000$ | 50,823 | Female | $\$ 39,000$ | 45,350 |
| Aboriginal Male | $\$ 49,000$ | 1,866 | Registered Indian | $\$ 38,000$ | 1,422 |
| White | $\$ 48,000$ | 92,543 | First Nations | $\$ 37,000$ | 1,748 |
| Métis | $\$ 46,000$ | 1,882 | Member in Band | $\$ 37,000$ | 1,343 |
| Aboriginal | $\$ 42,000$ | 3,630 | Aboriginal Female | $\$ 36,000$ | 1,764 |

Table 3. Highest degree attained by group and gender (\%).

| Degree attained | Aboriginal, total | White, <br> total | Degree attained | Aboriginal women | White <br> women |
| :---: | :---: | :---: | :---: | :---: | :---: |
| No Degree | 15.98 | 7.79 | No Degree | 13.32 | 5.84 |
| High School | 34.93 | 29.65 | High School | 33.56 | 29.67 |
| Trades | 6.58 | 6.32 | Trades | 4.82 | 5.27 |
| Apprenticeship | 6.31 | 6.15 | Apprenticeship | 1.64 | 1.55 |
| College | 22.75 | 24.72 | College | 28.85 | 28.55 |
| Bachelor's | 11.16 | 19.48 | Bachelor's | 15.14 | 22.89 |
| Master's | 2.04 | 4.65 | Master's | 2.49 | 5.24 |
| PhD | 0.19 | 0.63 | PhD | 0.11 | 0.46 |
| Medical | 0.06 | 0.60 | Medical | 0.06 | 0.54 |

$\left.\begin{array}{|l|l|l|l|l|l|}\hline \text { Degree attained } & \text { Aboriginal men } & \text { White } \\ \text { men }\end{array} \quad \begin{array}{l}\text { Degree attained }\end{array}\right)$

| Degree attained | Membership in a First Nations or Indian band |
| :--- | :--- |
| No Degree | 21.44 |
| High School | 33.66 |
| Trades | 5.88 |
| Apprenticeship | 4.91 |
| College | 21.44 |
| Bachelor's | 11.02 |
| Master's | 1.56 |
| PhD | 0.07 |
| Medical | 0.00 |

## Return to Education

- Clear that:
- aboriginals make less money than white Canadians, and:
- do not achieve as many years of schooling
- Lower dropout rate for Métis than for other aboriginals
- Higher dropout rate for indigenous in band


## Estimation Method: OLS - Reduced Form

$y_{i}^{D}=\boldsymbol{\beta}_{0}{ }^{D}+\boldsymbol{\beta}_{1}{ }^{D}$ Female $_{i}+\boldsymbol{\beta}_{2}{ }^{D}$ English $_{i}+\boldsymbol{\beta}_{3}{ }^{D}$ Married $_{i}+\boldsymbol{\beta}_{4}{ }^{D}$ PTWK $_{i}+\boldsymbol{\beta}_{5}{ }^{D}$ HDGREE $_{i}+$

$$
\boldsymbol{\beta}_{6}{ }^{D} \text { agegrp }_{i}+\boldsymbol{\beta}_{7}{ }^{D} \mathrm{PR}_{i}+\boldsymbol{\beta}_{8}^{D} \text { nChildren }+u_{i}^{D}
$$

Reference Group:

- White Male
- Single
- HS education
- No children
- Lives in Ontario
- Aged 30-34 years
- Works full-year, full-time
- Primary language is French


## Estimation Method: OLS

$$
\begin{aligned}
& y_{i}^{D}=\boldsymbol{\beta}_{0}{ }^{D}+\boldsymbol{\beta}_{1}{ }^{D} \text { Female }_{i}+\boldsymbol{\beta}_{2}{ }^{D} \text { English }_{i}+\boldsymbol{\beta}_{3}{ }^{D} \text { Married }_{i}+\boldsymbol{\beta}_{4}{ }^{D} \mathrm{PTWK}_{i}+\boldsymbol{\beta}_{5}{ }^{D} \mathrm{NoDegree}_{i}+ \\
& \boldsymbol{\beta}_{6}{ }^{D} \text { Trades }_{i}+\boldsymbol{\beta}_{7}{ }^{D} \text { Apprenticeship }_{i}+\boldsymbol{\beta}_{8}{ }^{D} \mathrm{Col}_{i}+\boldsymbol{\beta}_{9}{ }^{\mathrm{D}} \text { Bachelor }_{i}+\boldsymbol{\beta}_{10}{ }^{\mathrm{D}} \mathrm{Masters}_{i}+\boldsymbol{\beta}_{11}{ }^{D} \mathrm{PhD}_{i}+ \\
& \boldsymbol{\beta}_{12}{ }^{\mathrm{D}} \mathrm{Medical}_{i}+\boldsymbol{\beta}_{13}{ }^{\mathrm{D}} \mathrm{Age2O}_{2} 24_{i}+\boldsymbol{\beta}_{14}{ }^{\mathrm{D}} \mathrm{Age} 25 \_29_{i}+\boldsymbol{\beta}_{15}{ }^{\mathrm{D}} \mathrm{Age} 35 \_39_{i}+\boldsymbol{\beta}_{16}{ }^{\mathrm{D}} \mathrm{Age}^{2} 40 \_44_{i}+ \\
& \boldsymbol{\beta}_{17}{ }^{D} \text { Age } 45 \_49_{i}+\boldsymbol{\beta}_{18}{ }^{D} \text { Age50_54 }+\boldsymbol{\beta}_{19}{ }^{D} \text { Age55_59 }+\boldsymbol{\beta}_{20}{ }^{D} \text { Age60_64 }+\boldsymbol{\beta}_{21}{ }^{D} \mathrm{ATL}_{i}+\boldsymbol{\beta}_{22}{ }^{D} \mathrm{QC}_{i}
\end{aligned}
$$

$$
\begin{aligned}
& \beta_{29}{ }^{D} \text { pkid6_14i }+u_{i}^{D}
\end{aligned}
$$

Table 4. Robust regression for whites.

| y, log <br> employment <br> income | Coef. | St.Err. | y, log <br> employment <br> income | Coef. | St.Err. |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Female | $-0.42^{* * *}$ | 0.004 | Age40_44 | $0.185^{* * *}$ | 0.012 |
| English | -0.012 | 0.009 | Age45_49 | $0.233^{* * *}$ | 0.012 |
| Married | $0.266^{* * *}$ | 0.009 | Age50_54 | $0.24^{* * *}$ | 0.012 |
| PTWK | $-0.37^{* * *}$ | 0.005 | Age55_59 | $0.185^{* * *}$ | 0.012 |
| NoDegree | $-0.186^{* * *}$ | 0.009 | Age60_64 | $0.025^{* *}$ | 0.013 |
| Trades | 0.013 | 0.009 | ATL | $-0.165^{* * *}$ | 0.008 |
| Apprenticeship | $0.208^{* * *}$ | 0.009 | QC | $-0.113^{* * *}$ | 0.009 |
| Col | $0.203^{* * *}$ | 0.006 | MNT | $-0.026^{* *}$ | 0.011 |
| Bachelor | $0.475^{* * *}$ | 0.006 | SASK | $0.053^{* * *}$ | 0.011 |
| Masters | $0.722^{* * *}$ | 0.011 | AB | $0.197^{* * *}$ | 0.197 |
| PhD | $0.861^{* * *}$ | 0.027 | BC | $0.022^{* * *}$ | 0.008 |
| Medical | $1.168^{* * *}$ | 0.027 | pkid0_1 | $-0.14^{* * *}$ | 0.014 |
| Age20_24 | $-0.639^{* * *}$ | 0.013 | pkid2_5 | $0.036^{* * *}$ | 0.009 |
| Age25_29 | $-0.222^{* * *}$ | 0.014 | pkid6_14 | $0.028^{* * *}$ | 0.006 |
| Age35_39 | $0.107^{* * *}$ | 0.012 | Constant | $10.605^{* * *}$ | 0.015 |
| R-squared |  | 0.438 | Numberofobs |  | 92,543 |

Table 5. Robust regression for aboriginals.

| y, log <br> employment <br> income | Coef. | St.Err. | y, log <br> employment <br> income | Coef. | St.Err. |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Female | $-0.396^{* * *}$ | 0.022 | Age40_44 | $0.12^{* *}$ | 0.056 |
| English | 0.028 | 0.041 | Age45_49 | $0.149^{* * *}$ | 0.056 |
| Married | $0.319^{* * *}$ | 0.039 | Age50_54 | $0.112^{* *}$ | 0.056 |
| PTWK | $-0.373^{* * *}$ | 0.023 | Age55_59 | $0.105^{*}$ | 0.059 |
| NoDegree | $-0.08^{* *}$ | 0.033 | Age60-64 | -0.068 | 0.065 |
| Trades | $0.176^{* * *}$ | 0.046 | ATL | $-0.1^{* * *}$ | 0.039 |
| Apprenticeship | $0.279^{* * *}$ | 0.047 | QC | -0.029 | 0.05 |
| Col | $0.216^{* * *}$ | 0.03 | MNT | 0.013 | 0.034 |
| Bachelor | $0.494^{* * *}$ | 0.038 | SASK | $0.134^{* * *}$ | 0.042 |
| Masters | $0.685^{* * *}$ | 0.077 | AB | $0.262^{* * *}$ | 0.035 |
| PhD | $0.522^{* *}$ | 0.244 | BC | -0.01 | 0.035 |
| Medical | 0.586 | 0.454 | pkid0_1 | -0.116 | 0.074 |
| Age20_24 | $-0.592^{* * *}$ | 0.058 | pkid2_5 | -0.048 | 0.042 |
| Age25_29 | $-0.24^{* * *}$ | 0.061 | pkid6_14 | 0.009 | 0.028 |
| Age35_39 | $0.12^{* *}$ | 0.054 | Constant | $10.545^{* * *}$ | 0.068 |
| R-squared |  | 0.418 | Number of obs |  | 3,630 |

Explains the difference between the means of the dependent variables for different groups by decomposition

Estimation
Method: BlinderOaxaca Decomposition

Differentiate gaps in the observable characteristics of both groups from the gaps in the effects of the observable characteristics

Vets for differences in controls' sample means from the differences in the $\boldsymbol{\beta}$ of two groups

## Oaxaca Decomposition (continued)

$$
\begin{aligned}
& y^{W}-y^{A}=\boldsymbol{\beta}_{0}{ }^{W}+X^{W} \boldsymbol{\beta}^{W}-\boldsymbol{\beta}_{0}{ }^{A}+X^{A} \boldsymbol{\beta}^{A}+X^{A} \boldsymbol{\beta}^{W}-X^{A} \boldsymbol{\beta}^{W} \\
& y^{W}-y^{A}=\left(X^{W}-X^{A}\right) \boldsymbol{\beta}^{W}-\left[\left(\boldsymbol{\beta}_{0}^{A}-\boldsymbol{\beta}_{0}^{W}\right)+X^{A}\left(\boldsymbol{\beta}^{W}-\boldsymbol{\beta}^{A}\right)\right]
\end{aligned}
$$

Wage Gap = Explained + Unexplained

Table 6. Weighted two-fold Blinder-Oaxaca decomposition between whites and aboriginals.

| Group 1: White <br> Group 2: Aboriginal |  |  |
| :--- | :--- | :--- |
| y, log employment | Coef. | Std.Err. |
| income |  |  |
| Overall |  |  |
| White | $10.643^{* * *}$ | 0.003 |
| Aboriginal | $10.475^{* * *}$ | 0.016 |
| Difference | $0.168^{* * *}$ | 0.016 |
| Explained | $0.138^{* * *}$ | 0.010 |
| Unexplained | $0.029^{* * *}$ | 0.013 |


| Explained |  |  | Unexplained |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Female | 0.007* | 0.004 | Female | -0.014 | 0.013 |
| English | 0.002 | 0.001 | English | 0.012 | 0.044 |
| Married | 0.016*** | 0.002 | Married | -0.052 | 0.036 |
| PTWK | 0.012*** | 0.003 | PTWK | 0.021* | 0.010 |
| NoDegree | 0.016*** | 0.001 | NoDegree | -0.007 | 0.007 |
| Trades | 0.000 | 0.000 | Trades | -0.010** | 0.004 |
| Apprenticeship | -0.000 | 0.001 | Apprenticeship | -0.004 | 0.004 |
| Col | 0.004*** | 0.001 | Col | -0.004 | 0.008 |
| Bachelor | 0.039*** | 0.003 | Bachelor | -0.000 | 0.005 |
| Masters | 0.019*** | 0.002 | Masters | 0.002 | 0.002 |
| PhD | 0.004*** | 0.001 | PhD | 0.001 | 0.001 |
| Medical | 0.006*** | 0.001 | Medical | 0.000 | 0.000 |
| Age20_24 | 0.014*** | 0.003 | Age20_24 | -0.009 | 0.010 |
| Age25_29 | 0.005*** | 0.001 | Age25_29 | -0.003 | 0.006 |
| Age35_39 | $-0.003^{* * *}$ | 0.001 | Age35_39 | 0.002 | 0.007 |
| Age40_44 | -0.003** | 0.001 | Age40_44 | 0.007 | 0.009 |
| Age45_49 | 0.001 | 0.001 | Age45_49 | 0.012 | 0.009 |
| Age50_54 | 0.006*** | 0.002 | Age50_54 | 0.019* | 0.011 |
| Age55_59 | 0.007*** | 0.001 | Age55_59 | 0.015 | 0.009 |
| Age60_64 | -0.000 | 0.000 | Age60_64 | 0.006 | 0.006 |
| ATL | 0.002** | 0.001 | ATL | -0.002 | 0.005 |
| QC | $-0.011^{* * *}$ | 0.001 | QC | -0.005 | 0.006 |
| MNT | 0.003* | 0.002 | MNT | -0.009 | 0.006 |
| SASK | -0.001 | 0.001 | SASK | -0.013*** | 0.005 |
| AB | $-0.004^{* * *}$ | 0.001 | AB | -0.013** | 0.006 |
| BC | -0.000 | 0.000 | BC | 0.001 | 0.006 |
| pkid0_1 | -0.000 | 0.000 | pkid0_1 | -0.003 | 0.002 |
| pkid2_5 | -0.000 | 0.000 | pkid2_5 | 0.013** | 0.005 |
| pkid6_14 | -0.001* | 0.000 | pkid6_14 | 0.004 | 0.010 |
|  |  |  | Constant | 0.063 | 0.085 |

## Decomposition Findings

- My model finds that the explainable factors for income (education, marriage status, age bracket, etc.) account for 83.89 percent of the total wage gap
- Theoretically, the unexplained portion accounts for characteristics which should not affect income that do affect income
- However, discrimination is insidious
- Effects of discrimination could cause aboriginals to:
- drop out of schooling
- be discouraged to find a job, and become unemployed


## Limitations of Dataset

Does not account for:

- Unemployment rate
- Occupation
- Individuals with aboriginal ancestry, but do not identify as aboriginal themselves


## Major Takeaways

- Aboriginals suffer from lower levels of educational attainment
- Attrition in the school system possibly comes from discrimination
- Policymakers need to address non-economic factors (in addition to economic factors) to improve aboriginal labour market outcomes
- Young population -> much to be gained from improved education rates/culture

