## Online Appendix

## Patronage and Selection in Public Sector Organizations

Emanuele Colonnelli, Mounu Prem and Edoardo Teso

## Appendix A.1. Additional Tables and Figures



Figure A1. Municipalities with Close Elections
Notes: The figure shows how many times each Brazilian municipality enters the main sample of close elections, defined as elections with a 5 percentage points margin of victory or less between the winner and the runner-up, over the 4 elections in the 2000-2012 period.


Figure A2. Smoothness of Covariates at the Cutoff - Candidates (Part 1)
Notes: The figure shows shows graphical evidence for the smoothness of candidates' covariates in the pre-election period. Panel A: Age. Panel B: Contributions Received. Panel C: Contributions Spent. Panel D: Fed. Government Party. Panel E: Earnings Private $t=0$. Panel F: Earnings Private $t=-1$. Panel g: Earnings Public $t=0$. Panel H: Earnings Public $t=-1$. Panel I: Earnings Total $\mathrm{t}=0$. Panel J: Earnings Total $\mathrm{t}=-1$. Panel K: Employed Any $\mathrm{t}=0$. Panel L: Employed Any $\mathrm{t}=-1$. Panel M: Employed Private $t=0$. Panel N: Employed Private $t=-1$. Panel O: Employed Public t=0. Panel P: Employed Public $t=-1$. Panel Q: Employed Public Concurso $t=0$. Panel R: Employed Public Concurso $t=-1$. Panel S: Employed Bureaucrat - Manager t=0. Panel T: Employed Bureaucrat - Manager t=-1


Figure A3. Smoothness of Covariates at the Cutoff - Candidates (Part 2)
Notes: The figure shows shows graphical evidence for the smoothness of candidates' covariates in the pre-election period. Panel A: Employed Frontline High Skills $\mathrm{t}=0$. Panel b: Employed Frontline High Skills $\mathrm{t}=-1$. Panel C: Employed Frontline High Skills t=0. Panel D: Employed Frontline High Skills t=-1. Panel E: Employed Frontline Low Skills t=0. Panel F: Employed Frontline Low Skills $t=-1$. Panel G: Employed Qualified $t=0$. Panel H: Employed Qualified $t=-1$. Panel I: Employed Public-Discretionary $\mathrm{t}=0$. Panel J: Employed Public-Discretionary $\mathrm{t}=-1$. Panel K: Employed Unqualified $\mathrm{t}=0$. Panel L: Employed Unqualified t=-1. Panel M: Secondary School. Panel N: High School. Panel O: University Degree. Panel P: Mincer Sample. Panel Q: Incumbent. Panel R: Male. Panel S: Residual Ability Score. Panel T: President Party. Panel U: Run Past Election. Panel V: Governor Party. Panel W: Party Already in Power


Figure A4. Smoothness of Covariates at the Cutoff - Donors (Part 1)
Notes: The figure shows shows graphical evidence for the smoothness of donors' covariates in the pre-election period. Panel A: Fed. Government Party. Panel B: Mincer Sample. Panel C: Residual Ability Score. Panel D: President Party. Panel E: Earnings Private $t=0$. Panel F: Earnings Private $t=-1$. Panel g: Earnings Public $t=0$. Panel H: Earnings Public $t=-1$. Panel I: Earnings Total $t=0$. Panel J: Earnings Total $t=-1$. Panel K: Employed Any $t=0$. Panel L: Employed Any $t=-1$. Panel M: Employed Private $t=0$. Panel N: Employed Private $t=-1$. Panel O: Employed Public t=0. Panel P: Employed Public $t=-1$. Panel Q: Employed Public Concurso $t=0$. Panel R: Employed Public Concurso $t=-1$. Panel S: Employed Bureaucrat - Manager $t=0$. Panel T: Employed Bureaucrat - Manager $t=-1$


Figure A5. Smoothness of Covariates at the Cutoff - Donors (Part 2)
Notes: The figure shows shows graphical evidence for the smoothness of donors' covariates in the pre-election period. Panel A: Employed Frontline High Skills t=0. Panel b: Employed Frontline High Skills $\mathrm{t}=-1$. Panel C: Employed Frontline High Skills t=0. Panel D: Employed Frontline High Skills t=-1. Panel E: Employed Frontline Low Skills t=0. Panel F: Employed Frontline Low Skills $t=-1$. Panel G: Employed Qualified $t=0$. Panel H: Employed Qualified t=-1. Panel I: Employed Public-Discretionary $t=0$. Panel J: Employed Public-Discretionary $t=-1$. Panel K: Employed Unqualified $t=0$. Panel L: Employed Unqualified $\mathrm{t}=-1$. Panel M: Governor Party. Panel N: Amount of Contributions. Panel O: Party Already in Power.


Table A1. Additional Descriptive Statistics on Political Supporters

|  | $(1)$ <br> Mean | $(2)$ <br> Std. Dev. | $(3)$ <br> Min | $(4)$ <br> Max | $(5)$ <br> Observations |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Variable |  |  |  |  |  |
|  |  |  |  |  |  |
| Panel A: Candidates | 1.39 | 0.74 | 1 | 4 | $1,031,083$ |
| Times Candidate | 0.21 | 0.60 | 0 | 4 | $1,031,083$ |
| Times Elected | 0.14 | 0.35 | 0 | 1 | $1,031,083$ |
| Ever Elected | 1.72 | 0.69 | 1 | 4 | 274,792 |
| Number of Parties | 1,474 | 23,515 | 0 | $13,426,718$ | $1,079,734$ |
| Amount Spent in Race | 43.48 | 10.85 | 18 | 100 | $1,435,675$ |
| Age | 0.76 | 0.43 | 0 | 1 | $1,436,252$ |
| Male | 0.28 | 0.45 | 0 | 1 | $1,436,387$ |
| Less than Middle School | 0.22 | 0.41 | 0 | 1 | $1,436,387$ |
| Middle School | 0.35 | 0.48 | 0 | 1 | $1,436,387$ |
| High School | 0.16 | 0.36 | 0 | 1 | $1,436,387$ |
| College |  |  |  |  |  |
| Panel B: Donors |  |  |  |  |  |
| Number Elections | 1.07 | 0.27 | 1 | 3 | $1,057,216$ |
| Number of Parties | 1.08 | 0.41 | 1 | 21 | $1,057,216$ |
| Amount Donated | 727.23 | 5,795 | 0 | $5,609,230$ | $1,144,191$ |
| Donated to Winning Coalition | 0.48 | 0.5 | 0 | 1 | $1,144,191$ |

Notes: The table presents summary statistics on the electoral careers and demographic characteristics of the universe of candidates to a Brazilian municipal council (Panel A) and of donors in municipal elections (Panel B) analyzed in the paper. Times Candidate is the number of elections in which an individual runs, Times Elected is the number of elections in which an individual is elected to the council, Ever Elected is an indicator equal to one if the individual was ever elected to the council, Number of Parties is the number of different parties to which the candidate was affiliated (with summary statistics calculated only on the subsample of individuals running in multiple elections), Amount Spent in Race is the amount of money (in 2000 Brazilian Reals) spent by a candidate in the race (sample restricted to the 2004-2012 period), Age is the age of the individual at the time of the election, Male is an indicator for the candidate being male, Less than Middle School, Middle School, High School and College are indicator variables for a supporter's highest level of education. The unit of observation is an individual-election, except in the first four rows, where it is an individual. Number Elections is the number of elections in which an individual donated, Number of Parties is the number of different parties to which the individual donated, Amount Donated is the amount of money (in 2000 Brazilian Reals) spent by a candidate in the race, Donated to Winning Coalition is an indicator equal to one if the donation was directed to a party or a candidate in the coalition of the mayoral candidate who will be elected. The unit of observation is an individual for the variables Times Candidate, Times Elected, Ever Elected, Number of Parties, Number Elections and Number of Parties.

Table A2. Balance of Covariates: Candidates

| Covariate | (1) | (2) | (3) | (4) | (5) | (6) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Coefficient | P -value | Mean Cont. Group | Observations | Supporters | Elections |
| Earnings Public t=0 | 66.332 | 0.389 | 2,613 | 254,848 | 233,238 | 5,413 |
| Earnings Private t=0 | 21.740 | 0.454 | 794 | 254,848 | 233,238 | 5,413 |
| Earnings Total $\mathrm{t}=0$ | 69.593 | 0.407 | 3,697 | 254,848 | 233,238 | 5,413 |
| Employed Private t=0 | -0.004 | 0.179 | 0.113 | 254,848 | 233,238 | 5,413 |
| Employed Public t=0 | 0.008 | 0.140 | 0.255 | 254,848 | 233,238 | 5,413 |
| Employed Any t=0 | 0.002 | 0.696 | 0.379 | 254,848 | 233,238 | 5,413 |
| Employed Qualified $\mathrm{t}=0$ | 0.004 | 0.451 | 0.216 | 191,805 | 178,993 | 4,154 |
| Employed Unqualified $\mathrm{t}=0$ | 0.003 | 0.364 | 0.057 | 191,805 | 178,993 | 4,154 |
| Employed Bureaucrat - Manager $\mathrm{t}=0$ | 0.002 | 0.588 | 0.038 | 192,232 | 179,338 | 4,154 |
| Employed Bureaucrat - Lower Level $\mathrm{t}=0$ | 0.005 | 0.153 | 0.102 | 192,232 | 179,338 | 4,154 |
| Employed Frontline High Skills $\mathrm{t}=0$ | -0.001 | 0.862 | 0.063 | 192,232 | 179,338 | 4,154 |
| Employed Frontline Low Skills t=0 | 0.001 | 0.750 | 0.072 | 192,232 | 179,338 | 4,154 |
| Employed Public-Concurso t=0 | 0.007 | 0.091 | 0.177 | 254,848 | 233,238 | 5,413 |
| Employed Public-Discretionary $\mathrm{t}=0$ | 0.001 | 0.716 | 0.078 | 254,848 | 233,238 | 5,413 |
| Earnings Public t=-1 | 95.992 | 0.188 | 2,664 | 254,848 | 233,238 | 5,413 |
| Earnings Private $\mathrm{t}=-1$ | 34.461 | 0.234 | 816.5 | 254,848 | 233,238 | 5,413 |
| Earnings Total $\mathrm{t}=-1$ | 124.925 | 0.111 | 3,778 | 254,848 | 233,238 | 5,413 |
| Employed Private $\mathrm{t}=-1$ | -0.000 | 0.970 | 0.118 | 254,848 | 233,238 | 5,413 |
| Employed Public t=-1 | 0.007 | 0.172 | 0.267 | 254,848 | 233,238 | 5,413 |
| Employed Any t=-1 | 0.007 | 0.160 | 0.396 | 254,848 | 233,238 | 5,413 |
| Employed Qualified $\mathrm{t}=-1$ | 0.003 | 0.510 | 0.223 | 191,191 | 178,466 | 4,154 |
| Employed Unqualified $\mathrm{t}=-1$ | 0.003 | 0.318 | 0.062 | 191,191 | 178,466 | 4,154 |
| Employed Bureaucrat - Manager $\mathrm{t}=-1$ | 0.003 | 0.339 | 0.044 | 191,710 | 178,881 | 4,154 |
| Employed Bureaucrat - Lower Level t=-1 | 0.004 | 0.215 | 0.102 | 191,710 | 178,881 | 4,154 |
| Employed Frontline High Skills t=-1 | -0.001 | 0.656 | 0.069 | 191,710 | 178,881 | 4,154 |
| Employed Frontline Low Skills t=-1 | 0.001 | 0.724 | 0.071 | 191,710 | 178,881 | 4,154 |
| Employed Public-Concurso t=-1 | 0.007 | 0.075 | 0.178 | 254,848 | 233,238 | 5,413 |
| Employed Public-Discretionary t=-1 | 0.000 | 0.953 | 0.089 | 254,848 | 233,238 | 5,413 |
| Mincer Sample | 0.004 | 0.242 | 0.264 | 254,848 | 233,238 | 5,413 |
| Residual Ability Score | -0.065 | 0.478 | -0.681 | 67,445 | 63,423 | 5,060 |
| Secondary School | -0.002 | 0.700 | 0.216 | 252,805 | 231,500 | 5,413 |
| High School | -0.002 | 0.639 | 0.347 | 252,805 | 231,500 | 5,413 |
| University Degree | 0.008 | 0.015 | 0.147 | 252,805 | 231,500 | 5,413 |
| Age | 0.075 | 0.457 | 43.44 | 254,676 | 233,092 | 5,411 |
| Male | 0.000 | 0.929 | 0.762 | 254,824 | 233,216 | 5,413 |
| Run Past Election | -0.000 | 0.993 | 0.343 | 254,848 | 233,238 | 5,413 |
| Incumbent | -0.002 | 0.651 | 0.129 | 254,848 | 233,238 | 5,413 |
| Party Already in Power | 0.013 | 0.457 | 0.354 | 194,252 | 180,895 | 4,154 |
| Governor Party | 0.005 | 0.819 | 0.22 | 254,848 | 233,238 | 5,413 |
| Fed. Government Party | 0.014 | 0.321 | 0.483 | 254,848 | 233,238 | 5,413 |
| President Party | 0.012 | 0.472 | 0.109 | 254,848 | 233,238 | 5,413 |
| Contributions Received | 98.115 | 0.395 | 2,111 | 194,252 | 180,895 | 4,154 |
| Contributions Spent | 94.133 | 0.413 | 2,105 | 194,252 | 180,895 | 4,154 |

Notes: The table shows balance tests for candidates' covariates in the pre-election period. The coefficients and p-values in columns 1 and 2 are from regressions of the covariate on an indicator for treatment status (supporting the winning mayor), controlling for margin of victory and including election (i.e. municipality times election year) fixed effects, focusing on mayoral races decided by a margin of victory of 5 percentage points or less. Column 3 reports the mean of the covariate in the control group, namely among supporters of the runner-up party. Earnings Public/Private/Total are annual earnings in the public, private, and formal economy, respectively, in the year of the election $(t=0)$ or the year before the election ( $t=-$ 1). Employed Public/Private/Any are indicators taking value one if the supporter is employed in the public, private, and formal economy, respectively, in the year of the election $(\mathrm{t}=0$ ) or the year before the election $(\mathrm{t}=-1)$. Employed Bureaucrat - Manager/Bureaucrat - Lower Level/Frontline High Skills/Frontline Low Skills are indicators taking value one if the supporter is employed in a public sector occupation in the specific category, in the year of the election ( $t=0$ ) or the year before the election $(\mathrm{t}=-1)$. Employed Qualified/Unqualified are indicators taking value one if the supporters is employed in a public sector job for which she is qualified/unqualified in terms of education, in the year of the election ( $\mathrm{t}=0$ ) or the year before the election ( $\mathrm{t}=-1$ ). Employed Public-Concurso/Discretionary are indicators taking value one if the supporter is employed in a "meritocratic"/discretionary public sector job in the year of the election ( $\mathrm{t}=0$ ) or the year before the election ( $\mathrm{t}=-1$ ). Mincer Sample is an indicator taking value one if the supporter was ever employed in the private sector before her first election. Residual Ability Score is a continuous measure of ability derived using the approach described in section A.3. Secondary School, High School, and University Degree are indicators taking value one if the supporter's highest level of education is secondary school, high school, or university, respectively. Age is the supporter's age at the time of the election. Male is an indicator for the supporter being male. Run Past Election is an indicator taking value one if the candidate run also in the previous election. Incumbent is an indicator taking value one if the candidate had a seat in the municipal council at the time of the election. Party Already in Power, Governor Party, Fed. Government Party, President Party are indicators taking value one if the candidate's party is in the ruling coalition in power in the municipality at the time of the election, is the same as the state governor's party, is in the coalition of parties in the federal government, is the party of the Federal President, respectively. Contributions Received are the amount of contributions received by the candidate. Contributions Spent are the amount of contributions spent by the candidate in the race. P-values are based on standard errors clustered at the election level.

Table A3. Balance of Covariates: Donors

| Covariate | (1) | (2) | (3) |  | (4) | (5) | (6) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Coefficient | P -value | Mean Cont. | Group | Observations | Supporters | Elections |
| Earnings Public t=0 | 181.207 | 0.404 | 3,211 |  | 180,886 | 177,590 | 3,162 |
| Earnings Private $\mathrm{t}=0$ | -42.408 | 0.594 | 1,481 |  | 180,886 | 177,590 | 3,162 |
| Earnings Total $\mathrm{t}=0$ | -2.222 | 0.993 | 5,344 |  | 180,886 | 177,590 | 3,162 |
| Employed Private $\mathrm{t}=0$ | -0.001 | 0.857 | 0.192 |  | 180,886 | 177,590 | 3,162 |
| Employed Public t=0 | 0.010 | 0.342 | 0.222 |  | 180,886 | 177,590 | 3,162 |
| Employed Any t=0 | 0.009 | 0.359 | 0.423 |  | 180,886 | 177,590 | 3,162 |
| Employed Qualified t=0 | 0.007 | 0.496 | 0.183 |  | 180,040 | 176,783 | 3,162 |
| Employed Unqualified $\mathrm{t}=0$ | 0.003 | 0.342 | 0.035 |  | 180,040 | 176,783 | 3,162 |
| Employed Bureaucrat - Manager $\mathrm{t}=0$ | 0.006 | 0.287 | 0.044 |  | 180,463 | 177,178 | 3,162 |
| Employed Bureaucrat - Lower Level $\mathrm{t}=0$ | 0.001 | 0.842 | 0.088 |  | 180,463 | 177,178 | 3,162 |
| Employed Frontline High Skills t=0 | 0.001 | 0.758 | 0.056 |  | 180,463 | 177,178 | 3,162 |
| Employed Frontline Low Skills t=0 | 0.002 | 0.473 | 0.032 |  | 180,463 | 177,178 | 3,162 |
| Employed Public-Concurso t=0 | 0.007 | 0.296 | 0.134 |  | 180,886 | 177,590 | 3,162 |
| Employed Public-Discretionary t=0 | 0.003 | 0.667 | 0.089 |  | 180,886 | 177,590 | 3,162 |
| Earnings Public $\mathrm{t}=-1$ | 130.829 | 0.517 | 3,013 |  | 180,886 | 177,590 | 3,162 |
| Earnings Private $\mathrm{t}=-1$ | -117.652 | 0.126 | 1,487 |  | 180,886 | 177,590 | 3,162 |
| Earnings Total t=-1 | -151.033 | 0.539 | 5,116 |  | 180,886 | 177,590 | 3,162 |
| Employed Private $\mathrm{t}=-1$ | -0.002 | 0.802 | 0.198 |  | 180,886 | 177,590 | 3,162 |
| Employed Public t=-1 | 0.010 | 0.336 | 0.22 |  | 180,886 | 177,590 | 3,162 |
| Employed Any t=-1 | 0.006 | 0.496 | 0.427 |  | 180,886 | 177,590 | 3,162 |
| Employed Qualified $\mathrm{t}=-1$ | 0.008 | 0.372 | 0.181 |  | 180,052 | 176,800 | 3,162 |
| Employed Unqualified $\mathrm{t}=-1$ | 0.001 | 0.630 | 0.036 |  | 180,052 | 176,800 | 3,162 |
| Employed Bureaucrat - Manager t=-1 | 0.006 | 0.310 | 0.045 |  | 180,497 | 177,210 | 3,162 |
| Employed Bureaucrat - Lower Level $\mathrm{t}=-1$ | 0.001 | 0.762 | 0.087 |  | 180,497 | 177,210 | 3,162 |
| Employed Frontline High Skills $\mathrm{t}=-1$ | 0.000 | 0.917 | 0.055 |  | 180,497 | 177,210 | 3,162 |
| Employed Frontline Low Skills t=-1 | 0.002 | 0.348 | 0.031 |  | 180,497 | 177,210 | 3,162 |
| Employed Public-Concurso t=-1 | 0.006 | 0.344 | 0.132 |  | 180,886 | 177,590 | 3,162 |
| Employed Public-Discretionary t=-1 | 0.004 | 0.598 | 0.088 |  | 180,886 | 177,590 | 3,162 |
| Mincer Sample | 0.002 | 0.745 | 0.384 |  | 180,886 | 177,590 | 3,162 |
| Residual Ability Score | -0.481 | 0.107 | 0.32 |  | 68,134 | 67,243 | 2,828 |
| Party Already in Power | 0.039 | 0.367 | 0.435 |  | 180,886 | 177,590 | 3,162 |
| Governor Party | 0.005 | 0.909 | 0.208 |  | 180,886 | 177,590 | 3,162 |
| Fed. Government Party | 0.039 | 0.457 | 0.546 |  | 180,886 | 177,590 | 3,162 |
| President Party | 0.030 | 0.475 | 0.119 |  | 180,886 | 177,590 | 3,162 |
| Amount of Contributions | -17.667 | 0.842 | 1,387 |  | 180,886 | 177,590 | 3,162 |

Notes: The table shows balance tests for donors' covariates in the pre-election period. The coefficients and p-values in columns 1 and 2 are from regressions of the covariate on an indicator for treatment status (supporting the winning mayor), controlling for margin of victory and including election (i.e. municipality times election year) fixed effects, focusing on mayoral races decided by a margin of victory of 5 percentage points or less. Column 3 reports the mean of the covariate in the control group, namely among supporters of the runner-up party. Amount of Contributions is the donor's amount contributed to the party and coalition of the supported mayor. See Table A2 for a description of the other covariates listed in column 1.

Table A4. Balance of Covariates: Mayoral Candidate-Level Variables

|  | $(1)$ |  | $(2)$ |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Coefficient |  |  |  | P-value | Coan Cont. Group |
| :---: | (3) | $(4)$ |
| :---: |
| Observations | | Elections |
| :--- |
| Governor Party |

Notes: The table shows balance tests for donors' covariates in the pre-election period. The coefficients and p-values in columns 1 and 2 are from regressions of the covariate on an indicator for treatment status (winning the election), controlling for margin of victory and including election (i.e. municipality times election year) fixed effects, focusing on mayoral races decided by a margin of victory of 5 percentage points or less. Column 3 reports the mean of the covariate in the control group, namely in the party of the runner-up party. Governor Party is an indicator equal to one if the mayoral candidate's party is the party in power at the state level. Number of Parties in Coalition is the number of parties supporting the mayoral candidate. Incumbent is an indicator equal to one if the mayoral candidate's party is the incumbent party in the municipality. Number of Candidates/Donors are the number of candidates/donors who are supporters of the mayoral candidate. The covariates in rows 6 to 24 are indicators equal to one if the mayoral candidate belongs to that specific party (considering only parties involved in at least 50 close races over the sample period).

Table A5. Effect of Supporting the Winning Party - Winning versus Losing Candidates

|  | $(1)$ |  | $(2)$ |  | $(3)$ |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| Dependent Variable: | $c$ <br> Employed Public |  |  | $(4)$ |  |  |
| Total Earnings |  |  |  |  |  |  |

Notes: The table presents the estimated $\beta$ from equation (1), and the dependent variable is an indicator for employment in the public sector (columns 1-2) or total earnings (columns 3-4). Results in columns (1) and (3) are estimated on the sample of candidates to the council who won a seat in the council. Results in columns (2) and (4) are estimated on the sample of candidates to the council who did not win a seat. The sample is restricted to supporters of the winning party or of the runner-up in a close election, using a 5 percentage points margin of victory to define an election as close. "Mean D.V. Runner-up" shows the average of the dependent variable for the supporters of the runner-up in the post-election period. Standard errors are shown in parentheses and are double clustered at the supporter and election level.

Table A6. Effect of Supporting the Winning Party on Public and Private
Earnings

| Dependent Variable: <br> Group of Supporters: | (1) |  | (3) | (4) | (5) | (6) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Earnings Public |  |  | Earnings Private |  |  |
|  | All | Candidates | Donors | All | Candidates | Donors |
| Mayor | $\begin{gathered} 1,224.376 \\ (94.321) \end{gathered}$ | $\begin{gathered} 1,369.761 \\ (74.758) \end{gathered}$ | $\begin{gathered} 858.287 \\ (188.512) \end{gathered}$ | $\begin{aligned} & -110.537 \\ & (35.889) \end{aligned}$ | $\begin{gathered} -97.927 \\ (27.366) \end{gathered}$ | $\begin{aligned} & -145.062 \\ & (84.661) \end{aligned}$ |
| Observations | 1,447,538 | 867,888 | 550,832 | 1,447,538 | 867,888 | 550,832 |
| Mean D.V. Runner-up | 2,702 | 2,565 | 2,935 | 1,155 | 877 | 1,606 |
| Supporters | 418,146 | 233,238 | 177,590 | 418,146 | 233,238 | 177,590 |
| Elections | 5,419 | 5,413 | 3,162 | 5,419 | 5,413 | 3,162 |

Notes: The table presents the estimated $\beta$ from equation (1), and the dependent variable is an indicator for earnings in the public sector (columns 1-3) or earnings in the private sector (columns 4-6). Results in columns (1) and (4) are estimated on the sample of all supporters. Results in columns (2) and (5) are estimated on the sample of candidates to the local council, and results in columns (3) and (6) are estimated on the sample of donors. The sample is restricted to supporters of the winning party or of the runner-up in a close election, using a 5 percentage points margin of victory to define an election as close. "Mean D.V. Runner-up" shows the average of the dependent variable for the supporters of the runner-up in the post-election period. Standard errors are shown in parentheses and are double clustered at the supporter and election level.

Table A7. Effect of Supporting the Winning Party - Optimal Bandwidth and 1 Percentage Points Margin of Victory Bandwidth


Panel B: 1 Percentage Point Margin of Victory Bandwidth

| Mayor | 0.103 | 0.112 | 0.082 | $1,026.271$ | $1,077.375$ | 402.621 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $(0.011)$ | $(0.012)$ | $(0.019)$ | $(286.876)$ | $(194.306)$ | $(454.269)$ |
|  |  |  |  |  |  |  |
| Observations | 274,248 | 171,602 | 96,458 | 274,248 | 171,602 | 96,458 |
| Mean D.V. Runner-up | 0.223 | 0.240 | 0.197 | 4,260 | 3,751 | 5,249 |
| Supporters | 81,798 | 49,089 | 31,063 | 81,798 | 49,089 | 31,063 |
| Elections | 1,092 | 1,091 | 622 | 1,092 | 1,091 | 622 |

Notes: The table presents the estimated $\beta$ from equation (1), and the dependent variable is an indicator for employment in the public sector (columns 1-3) or total earnings (columns 4-6). Results in columns (1) and (4) are estimated on the sample of all supporters. Results in columns (2) and (5) are estimated on the sample of candidates to the local council, and results in columns (3) and (6) are estimated on the sample of donors. In Panel A, the sample is restricted to supporters of the winning party or of the runner-up in a close election, using an outcome- and sample-specific margin of victory to define close races, calculated using the optimal bandwidth selection procedure following Calonico, Cattaneo and Titiunik (2014). In Panel B, the sample is restricted to supporters of the winning party or of the runner-up in a close election, using a 1 percentage points margin of victory to define an election as close. "Mean D.V. Runner-up" shows the average of the dependent variable for the supporters of the runner-up in the post-election period. Standard errors are shown in parentheses and are double clustered at the supporter and election level.

Table A8. Effect of Supporting the Winning Party - By Connection Type

| Group of Supporters |  | (2) | (3) | (4) | (5) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Candidates |  | Donors |  |  |
| Connection to: | Party | Coalition | Mayor | Party | Coalition |
| Panel A: Dep. Var. is Employment Probability: |  |  |  |  |  |
| Mayor | $\begin{gathered} 0.136 \\ (0.007) \end{gathered}$ | $\begin{gathered} 0.117 \\ (0.006) \end{gathered}$ | $\begin{gathered} 0.114 \\ (0.014) \end{gathered}$ | $\begin{gathered} 0.071 \\ (0.016) \end{gathered}$ | $\begin{gathered} 0.033 \\ (0.012) \end{gathered}$ |
| Mean D.V. Runner-up | 0.243 | 0.242 | 0.211 | 0.193 | 0.187 |
| Panel B: Dep. Var. is Total Earnings: |  |  |  |  |  |
| Mayor | $\begin{aligned} & 1,452.576 \\ & (123.499) \end{aligned}$ | $\begin{aligned} & 1,150.620 \\ & (105.860) \end{aligned}$ | $\begin{aligned} & 1,230.035 \\ & (433.514) \end{aligned}$ | $\begin{aligned} & 1,039.502 \\ & (432.049) \end{aligned}$ | $\begin{aligned} & -138.243 \\ & (401.280) \end{aligned}$ |
| Mean D.V. Runner-up | 3,731 | 3,805 | 5,586 | 5,400 | 4,968 |
| Observations | 335,568 | 498,690 | 204,450 | 103,746 | 164,338 |
| Supporters | 90,367 | 141,524 | 66,211 | 33,390 | 55,359 |
| Elections | 5,327 | 4,586 | 2,151 | 1,641 | 1,738 |

Notes: The table presents the estimated $\beta$ from equation (1), and the dependent variable is an indicator for employment in the public sector (Panel A) or total earnings (Panel B). Results in column 1 consider candidates running in the mayoral candidate's party. Results in column 2 consider candidates running in other parties in the mayoral candidate's coalition. Results in column 3 consider donors to a mayoral candidate. Results in column 4 consider donors to the party of the mayoral candidate (but not to the mayoral candidate directly). Results in column 5 consider donors to other parties in the mayoral candidate's coalition. The sample is restricted to supporters of the winning party or of the runner-up in a close election, using a 5 percentage points margin of victory to define an election as close. "Mean D.V. Runner-up" shows the average of the dependent variable for the supporters of the runner-up in the post-election period. Standard errors are shown in parentheses and are double clustered at the supporter and election level.
Candidates and Donors

| Dep. Var. is Employment as: | (1) (2) <br> Bureaucrat Manager |  | (3) <br> (4) <br> Bureaucrat Lower Level |  | (5) (6) <br> Frontline High Skills |  | (7) <br> (8) <br> Frontline Low Skills |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  |  |  |  |
|  | Candidates | Donors | Candidates | Donors | Candidates | Donors | Candidates | Donors |
| Panel A: Type of occupation |  |  |  |  |  |  |  |  |
| Mayor | $\begin{gathered} 0.069 \\ (0.004) \end{gathered}$ | $\begin{gathered} 0.031 \\ (0.004) \end{gathered}$ | $\begin{gathered} 0.040 \\ (0.003) \end{gathered}$ | $\begin{gathered} 0.020 \\ (0.004) \end{gathered}$ | $\begin{gathered} 0.015 \\ (0.003) \end{gathered}$ | $\begin{gathered} 0.006 \\ (0.005) \end{gathered}$ | $\begin{gathered} 0.016 \\ (0.003) \end{gathered}$ | $\begin{gathered} 0.010 \\ (0.002) \end{gathered}$ |
| Observations | 609,018 | 548,694 | 609,018 | 548,694 | 609,018 | 548,694 | 609,018 | 548,694 |
| Mean D.V. Runner-up | 0.027 | 0.030 | 0.054 | 0.047 | 0.099 | 0.089 | 0.066 | 0.031 |
| Supporters | 177,659 | 177,011 | 177,659 | 177,011 | 177,659 | 177,011 | 177,659 | 177,011 |
| Elections | 4,153 | 3,159 | 4,153 | 3,159 | 4,153 | 3,159 | 4,153 | 3,159 |
| Panel B: Contract Type |  |  |  |  |  |  |  |  |
| Dep. Var. is Employment as: | Concurso |  | Discretionary |  | Municipal |  | State/Federal |  |
|  | Candidates | Donors | Candidates | Donors | Candidates | Donors | Candidates | Donors |
| Mayor | $\begin{gathered} 0.040 \\ (0.004) \end{gathered}$ | $\begin{gathered} 0.019 \\ (0.006) \end{gathered}$ | $\begin{gathered} 0.084 \\ (0.004) \end{gathered}$ | $\begin{gathered} 0.048 \\ (0.006) \end{gathered}$ | $\begin{gathered} 0.134 \\ (0.005) \end{gathered}$ | $\begin{gathered} 0.075 \\ (0.007) \end{gathered}$ | $\begin{gathered} -0.010 \\ (0.002) \end{gathered}$ | $\begin{aligned} & -0.008 \\ & (0.004) \end{aligned}$ |
| Observations | 867,888 | 550,832 | 867,888 | 550,832 | 867,888 | 550,832 | 867,888 | 550,832 |
| Mean D.V. Runner-up | 0.174 | 0.131 | 0.067 | 0.068 | 0.152 | 0.116 | 0.088 | 0.082 |
| Supporters | 233,238 | 177,590 | 233,238 | 177,590 | 233,238 | 177,590 | 233,238 | 177,590 |
| Elections | 5,413 | 3,162 | 5,413 | 3,162 | 5,413 | 3,162 | 5,413 | 3,162 |

Notes: The table presents the estimated $\beta$ from equation (1), and the dependent variables are indicators for employment in the occupational category of the public sector indicated in the title of the column. Panel A focuses on the type of occupation. Panel B focuses on the type of contract. Odd columns show results for candidates, while even columns show results for donors. The sample is restricted to supporters of the winning party or of the runner-up in a close election, using a 5 percentage points margin of victory to define an election as close. "Mean D.V. Runner-up" shows the average of the dependent variable for the supporters of the runner-up in the post-election period. Standard errors are shown in parentheses and are double clustered at the supporter and election level.
Table A9. Effect of Supporting the Winning Party for Different Types of Public Sector Occupations

Table A10. Public Sector Wage Premium

| Type of Job | (1) | (2) | (3) | (4) | (5) |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | All | Managerial | Professional | White Collar | Blue Collar |
|  | Jobs | Occupations | Occupations | Lower Lev | Workers |
| Panel A: Dep. Var. is Log Wage: |  |  |  |  |  |
| Public | $\begin{gathered} 0.072 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.074 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.219 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.066 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.037 \\ (0.000) \end{gathered}$ |
| R-squared | 0.453 | 0.304 | 0.451 | 0.335 | 0.359 |
| Panel B: Dep. Var. is Log Hourly Wage: |  |  |  |  |  |
| Public | $\begin{gathered} 0.160 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.222 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.227 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.183 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.136 \\ (0.000) \end{gathered}$ |
| R-squared Observations | 0.478 | 0.297 | 0.424 | 0.345 | 0.353 |
|  | 529,460,038 | 23,076,149 | 93,673,711 | 101,602,667 | 311,107,509 |

Notes: The table presents the public sector wage premium across four occupational categories. The dependent variable is the $\log$ of wage in Panel A and the log of hourly wage in Panel B, and the variables are winsorized at the $1 \%$ level. All regressions include controls for the worker's job tenure, the worker's age, municipality fixed effects, year fixed effects, and 43 fixed effects for the occupational group. The sample includes all worker-job pairs in the Brazilian public and private sector over the 2003-2014 period. Standard errors are shown in parentheses.

Table A11. Patronage and Selection - Bureaucrats vs Frontline Providers

| Panel A: Educational qualifications |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Type of Job | Bureaucrats |  |  | Frontline |  |  |
| Dep. Var. is Employment in Public Job Requiring: | (1) <br> Middle School Degree | (2) <br> High School Degree | (3) <br> University <br> Degree | (4) <br> Middle School Degree | (5) High School Degree | (6) University Degree |
| Mayor X Qualified | $\begin{gathered} 0.000 \\ (0.000) \end{gathered}$ | $\begin{gathered} -0.002 \\ (0.002) \end{gathered}$ | $\begin{gathered} 0.011 \\ (0.003) \end{gathered}$ | $\begin{gathered} -0.010 \\ (0.002) \end{gathered}$ | $\begin{gathered} -0.001 \\ (0.002) \end{gathered}$ | $\begin{gathered} -0.026 \\ (0.006) \end{gathered}$ |
| Mayor | $\begin{gathered} 0.000 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.041 \\ (0.003) \end{gathered}$ | $\begin{gathered} 0.058 \\ (0.004) \end{gathered}$ | $\begin{gathered} 0.017 \\ (0.002) \end{gathered}$ | $\begin{gathered} 0.006 \\ (0.002) \end{gathered}$ | $\begin{gathered} 0.012 \\ (0.002) \end{gathered}$ |
| Qualified | $\begin{gathered} 0.001 \\ (0.000) \end{gathered}$ | $\begin{gathered} 0.048 \\ (0.002) \end{gathered}$ | $\begin{gathered} 0.023 \\ (0.002) \end{gathered}$ | $\begin{gathered} 0.011 \\ (0.001) \end{gathered}$ | $\begin{gathered} 0.033 \\ (0.001) \end{gathered}$ | $\begin{gathered} 0.329 \\ (0.005) \end{gathered}$ |
| Observations | 601,354 | 601,354 | 601,354 | 601,354 | 601,354 | 601,354 |
| Mean D.V. Runner-up | 0.000 | 0.026 | 0.021 | 0.027 | 0.015 | 0.024 |
| Supporters | 175,845 | 175,845 | 175,845 | 175,845 | 175,845 | 175,845 |
| Elections | 4,152 | 4,152 | 4,152 | 4,152 | 4,152 | 4,152 |
| Panel B: Previous Private Earnings |  |  |  |  |  |  |
| Type of Job |  | ureaucrats |  |  | Frontline |  |
| Group of Supporters: | (1) <br> All Supporters | (2) <br> Candidates | (3) <br> Donors | (4) All Supporters | (5) <br> Candidates | (6) Donors |
| Mayor x Tercile 3 | $\begin{aligned} & -0.020 \\ & (0.005) \end{aligned}$ | $\begin{aligned} & -0.041 \\ & (0.008) \end{aligned}$ | $\begin{aligned} & -0.004 \\ & (0.006) \end{aligned}$ | $\begin{aligned} & -0.019 \\ & (0.004) \end{aligned}$ | $\begin{aligned} & -0.026 \\ & (0.008) \end{aligned}$ | $\begin{aligned} & -0.008 \\ & (0.005) \end{aligned}$ |
| Mayor x Tercile 2 | $\begin{aligned} & -0.005 \\ & (0.005) \end{aligned}$ | $\begin{aligned} & -0.007 \\ & (0.008) \end{aligned}$ | $\begin{aligned} & -0.002 \\ & (0.006) \end{aligned}$ | $\begin{aligned} & -0.008 \\ & (0.004) \end{aligned}$ | $\begin{aligned} & -0.009 \\ & (0.008) \end{aligned}$ | $\begin{aligned} & -0.009 \\ & (0.005) \end{aligned}$ |
| Mayor | $\begin{gathered} 0.086 \\ (0.007) \end{gathered}$ | $\begin{gathered} 0.146 \\ (0.010) \end{gathered}$ | $\begin{gathered} 0.034 \\ (0.008) \end{gathered}$ | $\begin{gathered} 0.030 \\ (0.006) \end{gathered}$ | $\begin{gathered} 0.035 \\ (0.009) \end{gathered}$ | $\begin{gathered} 0.028 \\ (0.007) \end{gathered}$ |
| Tercile 3 | $\begin{aligned} & -0.006 \\ & (0.002) \end{aligned}$ | $\begin{aligned} & -0.011 \\ & (0.004) \end{aligned}$ | $\begin{array}{r} -0.005 \\ (0.003) \end{array}$ | $\begin{gathered} -0.006 \\ (0.003) \end{gathered}$ | $\begin{aligned} & -0.010 \\ & (0.005) \end{aligned}$ | $\begin{aligned} & -0.006 \\ & (0.004) \end{aligned}$ |
| Tercile 2 | $\begin{aligned} & -0.005 \\ & (0.002) \end{aligned}$ | $\begin{aligned} & -0.005 \\ & (0.004) \end{aligned}$ | $\begin{aligned} & -0.002 \\ & (0.003) \end{aligned}$ | $\begin{aligned} & -0.001 \\ & (0.003) \end{aligned}$ | $\begin{aligned} & -0.006 \\ & (0.005) \end{aligned}$ | $\begin{gathered} 0.001 \\ (0.004) \end{gathered}$ |
| Observations | 201,382 | 82,022 | 117,048 | 201,382 | 82,022 | 117,048 |
| Mean D.V. Runner-up | 0.041 | 0.046 | 0.038 | 0.056 | 0.065 | 0.050 |
| Supporters | 66,140 | 26,108 | 39,402 | 66,140 | 26,108 | 39,402 |
| Elections | 3,343 | 2,998 | 2,499 | 3,343 | 2,998 | 2,499 |
| Panel C: Residual Ability Score |  |  |  |  |  |  |
| Group of Supporters: | (1) All Supporters | (2) <br> Candidates | (3) <br> Donors | (4) All Supporters | (5) <br> Candidates | (6) Donors |
| Mayor x Tercile 3 | $\begin{gathered} -0.027 \\ (0.004) \end{gathered}$ | $\begin{gathered} -0.020 \\ (0.007) \end{gathered}$ | $\begin{gathered} -0.021 \\ (0.006) \end{gathered}$ | $\begin{gathered} -0.004 \\ (0.005) \end{gathered}$ | $\begin{gathered} 0.001 \\ (0.008) \end{gathered}$ | $\begin{gathered} -0.008 \\ (0.006) \end{gathered}$ |
| Mayor x Tercile 2 | $\begin{aligned} & -0.017 \\ & (0.005) \end{aligned}$ | $\begin{aligned} & -0.008 \\ & (0.007) \end{aligned}$ | $\begin{aligned} & -0.022 \\ & (0.006) \end{aligned}$ | $\begin{gathered} 0.002 \\ (0.005) \end{gathered}$ | $\begin{gathered} 0.004 \\ (0.008) \end{gathered}$ | $\begin{aligned} & -0.006 \\ & (0.006) \end{aligned}$ |
| Mayor | $\begin{gathered} 0.117 \\ (0.007) \end{gathered}$ | $\begin{gathered} 0.153 \\ (0.009) \end{gathered}$ | $\begin{gathered} 0.073 \\ (0.010) \end{gathered}$ | $\begin{gathered} 0.034 \\ (0.006) \end{gathered}$ | $\begin{gathered} 0.039 \\ (0.009) \end{gathered}$ | $\begin{gathered} 0.028 \\ (0.008) \end{gathered}$ |
| Tercile 3 | $\begin{aligned} & -0.037 \\ & (0.003) \end{aligned}$ | $\begin{aligned} & -0.032 \\ & (0.004) \end{aligned}$ | $\begin{aligned} & -0.039 \\ & (0.004) \end{aligned}$ | $\begin{gathered} -0.081 \\ (0.004) \end{gathered}$ | $\begin{aligned} & -0.080 \\ & (0.005) \end{aligned}$ | $\begin{aligned} & -0.067 \\ & (0.005) \end{aligned}$ |
| Tercile 2 | $\begin{aligned} & -0.040 \\ & (0.003) \end{aligned}$ | $\begin{aligned} & -0.033 \\ & (0.004) \end{aligned}$ | $\begin{aligned} & -0.039 \\ & (0.004) \end{aligned}$ | $\begin{aligned} & -0.079 \\ & (0.004) \end{aligned}$ | $\begin{gathered} -0.076 \\ (0.005) \end{gathered}$ | $\begin{aligned} & -0.068 \\ & (0.005) \end{aligned}$ |
| Observations | 376,784 | 170,796 | 204,396 | 376,784 | 170,796 | 204,396 |
| Mean D.V. Runner-up | 0.102 | 0.098 | 0.102 | 0.176 | 0.199 | 0.146 |
| Supporters | 122,806 | 53,731 | 68,683 | 122,806 | 53,731 | 68,683 |
| Elections | 3,945 | 3,865 | 3,084 | 3,945 | 3,865 | 3,084 |

Notes: The table presents the estimated coefficients from equation (4). In Panel A, the dependent variables are indicators for employment in a public sector job that requires a middle school degree (columns 1 and 4 ), high school degree (columns 2 and 5) and university degree (columns 3 and 6). Qualified is an indicator equal to one if the supporter has an educational level that qualifies her for the job. The sample includes candidates to the local council. In Panel B, Tertile 2 and Tertile 3 are indicators equal to one if supporters fall in the second or third tercile, respectively, of supporters' private sector earnings in the years before the election. In Panel C, Tertile 2 and Tertile 3 are indicators equal to one if supporters fall in the second or third tercile, respectively, of supporters' Residual Ability Scores, calculated as explained in Section Section V.A. Columns 1-3 focus on jobs as bureaucrats, while columns 4-6 focus on jobs as frontline providers. The sample is restricted to supporters of the winning party or of the runner-up in a close election, using a 5 percentage points margin of victory to define an election as close. "Mean D.V. Runner-up" shows the average of the dependent variable in the post-election period for the supporters of the runner-up who are unqualified for the job (Panel A) or in the bottom tercile (Panels B and C). Standard errors are shown in parentheses and are double clustered at the supporter and election level.

## Appendix A.2. Returns from Donations

In this section, we explain how we calculate the return on donors' investment, introduced in Section IV.C. Calculating returns from donations is not straightforward. Ideally, we would like to estimate the effect of being connected to the winning mayoral candidate on total earnings after the election, conditional on the amount donated, for the close races of our sample. This would allow us to construct, for each given donation amount, the return on investment. In practice, doing this would require a sufficiently high number of donors donating exactly the same amount who are involved in close races. We therefore approximate this computation as follows:

- We divide the donors on the two sides into BRL 50 bins, based on the amount donated. We keep the 37 such bins with at least 200 donors falling in the bin, in order to have enough power to estimate the return.
- For each bin $k$ and year $t=\{1,2,3,4\}$ after the election, we separately estimate the effect of supporting the winning mayoral candidate on total earnings, in each $t\left(\hat{\beta}_{k t}\right)$ (focusing only on close elections).
- The return on investment for donor $i$ contributing $c_{i} \in k$ is then:

$$
\text { Return }_{i}=\frac{\frac{1}{2} \sum_{t=1}^{4} \frac{\hat{\beta}_{k t}}{(1+r)^{t}}-c_{i}}{c_{i}}
$$

where $r$ is the discount rate in the election year corresponding to the given donation. This return is calculated summing the discounted total earnings caused by the donation, and multiplying this sum by the probability that the investment pays off (i.e., that the supported mayoral candidate wins), which is assumed to be $50 \%$ since these are close elections, and therefore a toss-up race.

Using this approach, we find that the median return on investment is of BRL 1.89 for BRL 1 donated. However, if we exclude donors who contributed less than BRL 50, this drops to a lower, albeit still sizable, BRL 1.18 for BRL 1 donated. This drop can be rationalized by the fact that, as documented in Figure 3 in the paper, we find a sizable treatment effect on employment probability even for donors making small contributions.

Two are the main limitations of this approach. First, we are not considering the precision of the estimates $\left(\hat{\beta}_{k t}\right)$ in the computation of the expected return. Second, and as discussed in Section IV.C of the paper, the amount of money donated by a supporter cannot be considered exogenous. Our estimates should be interpreted with these caveats in mind.

## Appendix A.3. Mincer Regression Approach

As discussed in Section V.A,, in order to obtain a measure of supporters' individual ability that goes beyond easily observable individual characteristics, we follow the approach in Besley et al. (2017) and Dal Bó et al. (2017).

We estimate a series of Mincer earnings regressions for each year between 1995 and 2014 using information on all Brazilian private sector employees. We use observations for candidates and donors only in years before the first election in which they run/donate. Specifically, we take residuals from the following regression, which is estimated for each year and separately for men and women, in order to account for gender-specific differences in labor-market outcomes :

$$
\begin{equation*}
y_{i, m, t}=f\left(\text { age }_{i, t}, \text { education }_{i, t}, \text { sector }_{i, t}\right)+\alpha_{m}+\epsilon_{i, m, t} \tag{A1}
\end{equation*}
$$

where $y_{i, m, t}$ are hourly private sector earnings of individual $i$ working in municipality $m$ in year $t, a g e_{i, t}$ are a set of age fixed effects (over 5 -years intervals), education $i_{i, t}$ are four fixed effects for individual educational level (less than middle school, middle school degree, high school degree, university degree), sector $i_{i, t}$ are fixed effects for the sector of $i$ 's firm. We include a full-set of interactions between these variables, as well as municipality fixed effects $\left(\alpha_{m}\right)$ to account for location-specific differences in earnings. Our residual ability score is the average of each individual's residuals across all years in which she is employed in the private sector.

