

The role of teachers' expectation on the human capital formation technology

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Outline

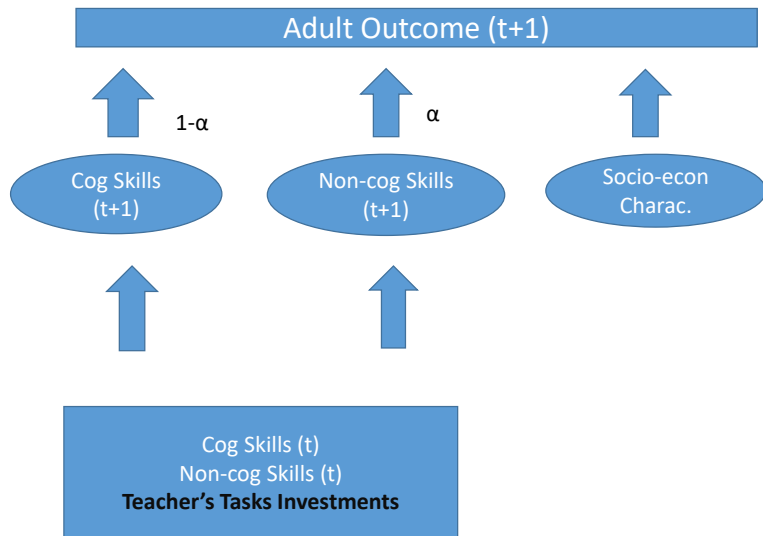
- 1 Introduction
- 2 Human Capital Formation Technology
- 3 Measures
- 4 Sampling and Fieldwork
- 5 Descriptive Statistics
- 6 Empirical Model
- 7 Results
- 8 Conclusion
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Introduction

- The role of subjective expectations about returns is well documented in the education literature.
 - Psychology: Hunt (1961), Vygostky (1978), Nespov (1987), Mutua (2012).
 - Economics of education: Jensen (2010), Lee et al (2012), Cunha et al (2016), Boneva and Rauh (2018).
- Most of the literature focused on parental beliefs (Dizon-Ross (2019)).
- However, it is also well documented that teachers play a fundamental role on children formation.
 - Cognitive skills: Hanushek (2006), Rockoff (2004), Chetty et al (2014).
 - Socioemotional skills: Jackson (2018).
- Teachers' expectation is also important: Dobie and Fryer (2012), Pinto and Ponczek (2018) and Papageorge et al (2016).

- Our goal is threefold
 - Elicit teachers' beliefs on the relative importance of cognitive and socioemotional skills on human capital formation.
 - Show how beliefs play an important role on teachers' allocation on different tasks.
 - Evaluate an intervention that sends information to teacher about the importance of socioemotional skills.
- We are collecting data on 84 municipal schools in Rio. Data from 168 3rd and 4th-grade teachers and around 3,500 students.

Human Capital Formation Technology



- **Assumption:** Teachers maximize the expectation of adult outcome
- This expected value will depend on:
 - Teacher's belief on the importance of non-cognitive skills
($\phi^\tau = E[\alpha | \Omega^\tau, \theta_t^N, \theta_t^C]$)
 - Teacher's Tasks Investments

● Expectation and Investment Measure

- 1st Part: **Effort allocation** in each of the teaching practices (inside or outside the classroom). Total effort should sum 100.

Dentro da sala de aula – atividades devem somar 100 unidades de esforço

| | |
|---|--------------------------------|
| Resolver/discutir questões da matéria em sala de aula | <input type="text" value="0"/> |
| Incentivar os alunos a buscarem métodos alternativos para resolver os problemas que encontram dificuldades ou a se aprofundarem no conteúdo | <input type="text" value="0"/> |
| Elogiar o esforço dos alunos | <input type="text" value="0"/> |
| Buscar relacionar o conteúdo da matéria ao cotidiano dos alunos | <input type="text" value="0"/> |
| Encorajar bom comportamento | <input type="text" value="0"/> |
| Passar e/ou corrigir tarefa de casa | <input type="text" value="0"/> |
| Realizar avaliações com o intuito de identificar as dificuldades dos alunos | <input type="text" value="0"/> |
| Estimular a autonomia dos alunos e a participação deles em aula | <input type="text" value="0"/> |
| Revisar com os alunos o conteúdo anterior antes de avançar para um conteúdo novo | <input type="text" value="0"/> |
| Estabelecer conexões emocionais com os alunos | <input type="text" value="0"/> |
| Estimular os alunos a trabalharem em grupo | <input type="text" value="0"/> |

- **Expectation and Investment Measure**

- 2nd Part: **Rank of teaching practices** according to their priors on how much each practice develops students' **socioemotional skills**.

Para as práticas de dentro da sala de aula arraste cada prática até a posição que esta ocupa no seu ordenamento, de forma que a 1ª **deve ser aquela que você acredita que mais desenvolve habilidades socioemocionais**. A 11ª prática será aquela que menos desenvolve habilidades socioemocionais.

Dentro da sala de aula:

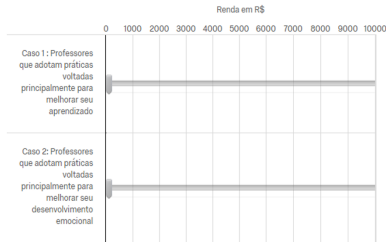
| | |
|---|----|
| Estimular a autonomia dos alunos e a participação deles em aula | 1 |
| Resolver/discutir questões da matéria em sala de aula | 2 |
| Passar e/ou corrigir tarefa de casa | 3 |
| Buscar relacionar o conteúdo da matéria ao cotidiano dos alunos | 4 |
| Revisar com os alunos o conteúdo anterior antes de avançar para um conteúdo novo | 5 |
| Encorajar bom comportamento | 6 |
| Elogiar o esforço dos alunos | 7 |
| | 8 |
| Incentivar os alunos a buscarem métodos alternativos para resolver os problemas que encontram dificuldades ou a se aprofundarem no conteúdo | |
| Realizar avaliações com o intuito de identificar as dificuldades dos alunos | 9 |
| Estabelecer conexões emocionais com os alunos | 10 |
| Estimular os alunos a trabalharem em grupo | 11 |

● Expectation and Investment Measure

- 3rd Part: **Teachers' expectations** on future wage and schooling of students with different combinations of cognitive and non-cognitive skills.

Ana tem facilidade de aprendizado e é responsável. Além disso, ela nunca se envolve em conflitos com seus colegas e trabalha bem em grupo. Apesar de se frustrar algumas vezes, com situações escolares ou pessoais, Ana lida bem com os problemas que enfrenta.

Qual **renda** você acha que a **Ana** receberá aos 25 anos caso, por toda sua vida escolar, tenha professores como os dos casos abaixo:



- 1 How beliefs are formed? (Rokeach, M., 1960)
 - Self-generated: Experience, Experiment, Reflection.
 - Externally generated: Information, Experts, Authority, etc.
 - Reverse Causality: Teaching practices (experience) might impact belief and not the other way around.
⇒ We randomly selected participants for an information intervention (text messages: change in information set).

1st Challenge: Endogeneity

- **Information Intervention (T_1):** Text messages during 2018 school-year.
 - Treatment: 14 messages with pieces of evidences on the importance of socioemotional skills (+ 14 control messages).
 - Eg. "It is well documented that socioemotional skills are rewarded in the labor market in the form of higher wages and a shorter period of unemployment."
 - Control: 14 messages with general info about the Brazilian school system.
 - Eg. "There are approximately 280 thousand schools in Brazil and about 5% of these are in the State of Rio de Janeiro."

1st Challenge: Endogeneity

- Focus Group of the Messages with 27 elementary school teachers of a Sao Paulo municipal school with SEL.

Existem cerca de 3 mil escolas indígenas no Brasil, mais de 60% delas localizadas na região Norte do país.

Você estava familiarizada com a informação acima?

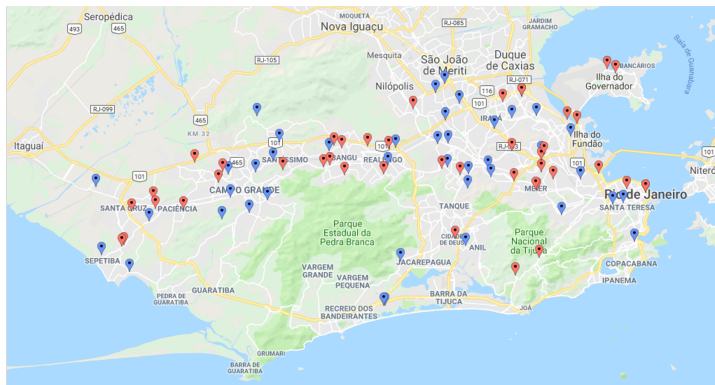
- Sim
- Não

A informação acima faria com que você repensasse as práticas adotada em sala de aula?

- Sim
- Não

- 83% (73%) of teacher's said they would rethink their teaching practices after reading treatment (control) messages.

Information Intervention: Text Messages



📍 Treatment – Intervention 2 (belief's text messages) 📍 Control – Intervention 2 (belief's text messages)

Challenges

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- 2 From beliefs to practice (Schraw and Olafson, 2006):
 - Teacher beliefs may not predict behavior. Problems with instrumentation due to lack of knowledge.
⇒ SEL Intervention train teachers how to implement "socioemotional tasks".

2nd Challenge: Know-how

- **SEL Intervention (T_2): *Programa Compasso***

- Created by a Brazilian NGO called *Vila Educacao*; based on the American *Second Step*.
- Regular school teachers are trained in the methodology to teach 22 socioemotional lessons once a week.
- Lessons: Skills for learning, empathy, emotion management and problem solving.
- Material: student's handbook (homeworks for family integration), CDs, DVDs and teacher's handbook.
- Fonseca et al (2018): companion paper with a preliminary evaluation of PC effects using data from 2017 implementation in Rio.
 - Some significant on executive functions and angry bias, especially on violent neighborhood.

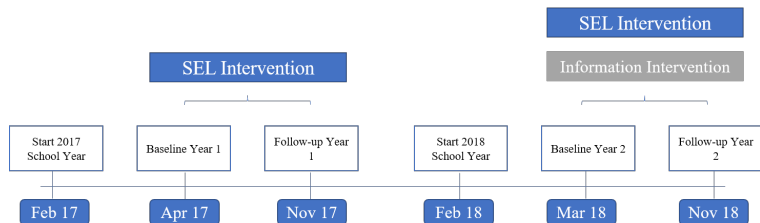
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- 3 Measurement Error on Teaching Practices (Stigler and Hiebert, 1999)
 - Teachers report what they believe and not what they actually do.
⇒ Class Observation: random sample of 20 schools (40 classrooms) during the month of October.

3rd Challenge

- Measurement Error on Teaching Practices (Stigler and Hiebert, 1999)
 - Teachers report what they believe and not what they actually do.
 - ⇒ Class Observation: random sample of 20 schools (40 classrooms) during the month of October.
 - Double-coded
 - Task intensity on a likert-scale
 - Correlation with teacher report: 68%.
 - Measurement error is not different for treated and controls

Sampling and Fieldwork



- 2017 sample: 94 schools; Around 4000 students(3rd and 5th grade); 188 teachers.
- 2018 sample: 84 (out of 2017's 94) schools; Around 3500 students(3rd and 4th grade); 168 teachers.

- **Teachers' Measures:**

- Growth Mindset
- Perceived Stress Scale
- Teacher Efficacy
- **Teacher Expectation and Investments Measure** - only in 2018

- **Students' Measures:**

- Cognitive Skills (Executive Function and Vocabulary)
- Socioemotional Competences (ACES and teacher's report)

Sampling and Fieldwork

Table 1: Take-up

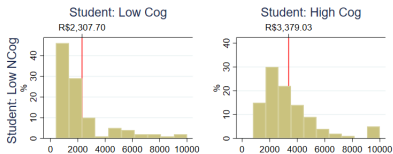
| | $T_1 = 1$ | | $T_1 = 0$ | | Total | |
|---------------------------|-----------------|-----------|-----------------|-----------|------------|--|
| | $T_2 = 1$ | $T_2 = 0$ | $T_2 = 1$ | $T_2 = 0$ | | |
| Sample (100%) | 42 | 42 | 42 | 42 | 168 | |
| Baseline | 27 (64%) | 23 (55%) | 27 (64%) | 24 (57%) | 101 (60%) | |
| Follow-up | 38 (90%) | 35 (83%) | 35 (83%) | 32 (76%) | 140 (83%) | |
| Both Baseline + Follow-up | 27 (64%) | 21 (50%) | 24 (57%) | 21 (50%) | 93 (55%) | |
| T_1 Total | 48 (57%) | | 45 (54%) | | | |

- No evidence of unbalance nor selective attrition.
- Teachers from both groups are similar on observables.
- Statistical power compromised.

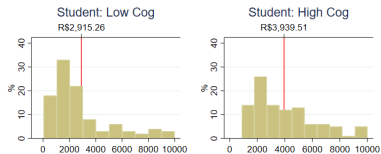
Expected Wages - Baseline

Expected Wages

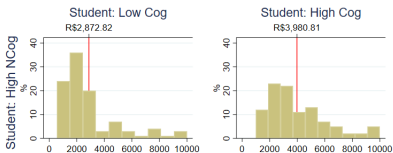
Teacher: Cog



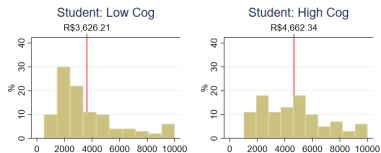
Teacher: NCog



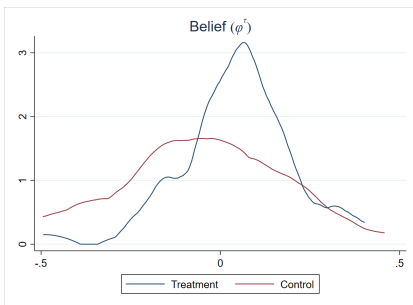
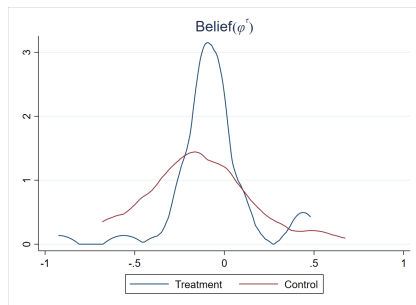
Teacher: Cog



Teacher: NCog

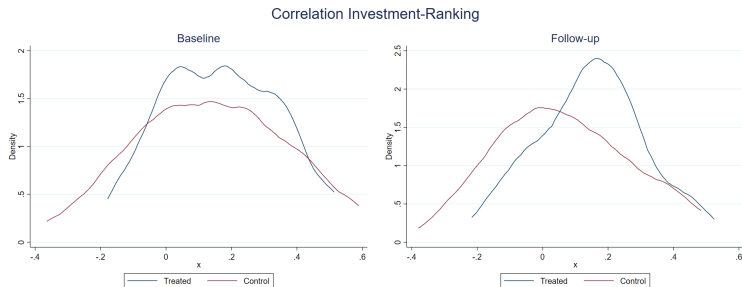


- Beliefs (Baseline vs Follow-up)



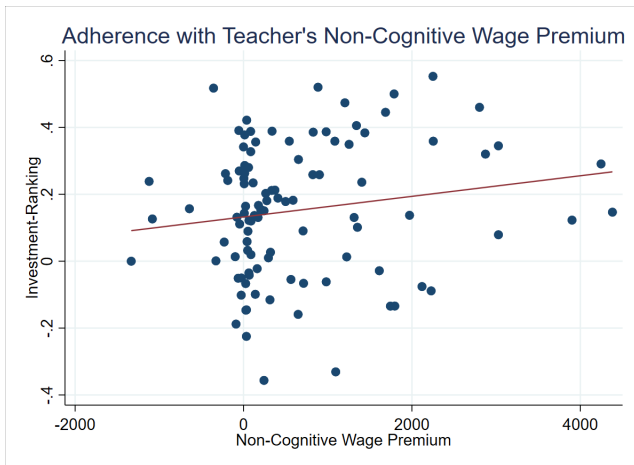
Descriptive Statistics

- How we measure the investments (effort) of the teachers on non-cog tasks?
 - Investment-Ranking: correlation between task-investments and task-ranking (baseline).
 - We fixed baseline task-ranking.



- This is robust to many different definitions of Investment-Ranking.

Descriptive Statistics



Exploring the Message Treatment - Empirical Method

- Main Model:

$$\beta_1^T = \alpha_0 + \alpha_1 \beta_0^T + \alpha_2 \phi_0^T + \alpha_3 \phi_1^T + \sum_{i=1}^{21} \gamma_i d_{strata_i} + \varepsilon^T$$

$$\phi_1^T = \mu_0 + \mu_1 T_1 + \mu_2 \beta_0^T + \mu_3 \phi_0^T + \sum_{i=1}^{21} \delta_i d_{strata_i} + u^T$$

- β_t^T : correlation in t between task-investments and baseline task-ranking, ie, $Corr(r(S_{ij})_t, (r(\alpha_j^N) - r(\alpha_i^N))_0)$
- ϕ_t : non-cognitive expectation measure in t .
- T_1 as an instrument for ϕ_1^T .
- Dependent variable estimated: bootstrap or WLS (inverse of β_1^T variance)

Table 2: First Stage

| | (1) | (2) | (3) | (4) |
|---|---------------------|---------------------|--------------------|---------------------|
| Treatment (T_1) | 0.115*** (0.042) | 0.145*** (0.044) | 0.115** (0.052) | 0.145*** (0.054) |
| Baseline Expectation (ϕ_0) | 0.146 (0.146) | 0.176 (0.153) | 0.146 (0.164) | 0.176 (0.177) |
| Baseline Correlation Investment-Ranking (β_0) | -0.115 (0.157) | -0.188 (0.152) | -0.115 (0.171) | -0.188 (0.176) |
| R^2 | 0.268 | 0.331 | 0.268 | 0.331 |
| Observations | 93 | 93 | 93 | 93 |
| Covariates: | | | | |
| Strata Fixed Effects | x | x | x | x |
| Teacher's Covariates | | x | | x |
| Method: | | | | |
| OLS | x | x | x | x |
| Bootstrap (500 reps) | | | x | x |

Table 3: Second Stage - IV

| | (1) | (2) | (3) | (4) | (5) | (6) |
|-------------------------------|---------------------------------|---------------------------------|--------------------------------|---------------------------------|--------------------------------|---------------------------------|
| Baseline Correlation | 0.553*** (0.158) | 0.550*** (0.146) | 0.553*** (0.167) | 0.567*** (0.150) | 0.553*** (0.163) | 0.550*** (0.146) |
| Baseline Expectation Measure | -0.256* (0.142) | -0.254** (0.125) | -0.211 (0.151) | -0.221* (0.130) | -0.256 (0.318) | -0.254* (0.130) |
| Follow-up Expectation Measure | 0.654* (0.376) | 0.514* (0.275) | 0.696 (0.444) | 0.529* (0.300) | 0.654 (0.996) | 0.514* (0.277) |
| Constant | -0.204 (0.315) | -0.092 (0.264) | -0.160 (0.332) | -0.068 (0.257) | -0.204 (0.534) | -0.092 (0.263) |
| Observations | 93 | 93 | 93 | 93 | 93 | 93 |
| Covariates: | | | | | | |
| <i>Strata Fixed Effects</i> | x | x | x | x | x | x |
| <i>Teacher's Covariates</i> | | x | | x | | x |
| Method: | | | | | | |
| <i>GMM</i> | x | x | x | x | x | x |
| <i>WLS</i> | | | x | x | | |
| <i>Bootstrap (500 reps)</i> | | | | | x | x |

- Results are larger for inside than for outside the classroom tasks.

So Far...

- T_1 (Information intervention) has an impact of 0.1 on teacher's expectations.
- Increased expectations get teachers to invest 50% more in "socioemotional- tasks".
- Further Questions: (i) Do teachers know how to implement socioemotional tasks? Teacher's from SEL intervention do. (ii) Is it possible that the results above are actually from SEL intervention?

Table 4: Using T_2 instead of T_1

| | (1) | (2) | (3) | (4) |
|-----------------------------|-------------------|-------------------|-------------------|-------------------|
| SEL Treatment (T_2) | -0.051 (0.053) | -0.039 (0.053) | -0.051 (0.056) | -0.039 (0.058) |
| Baseline Expectation | 0.245 (0.149) | 0.264* (0.149) | 0.245 (0.166) | 0.264 (0.185) |
| R^2 | 0.216 | 0.242 | 0.216 | 0.242 |
| Observations | 93 | 93 | 93 | 93 |
| Covariates: | | | | |
| <i>Strata Fixed Effects</i> | x | x | x | x |
| <i>Teacher's Covariates</i> | | x | | x |
| Method: | | | | |
| <i>OLS</i> | x | x | x | x |
| <i>Bootstrap (500 reps)</i> | | | x | x |

Further Outcomes - Very Preliminary

Table 5: Effects on Students' Outcomes

| | Cognitive Scores | | | Non-Cognitive Scores | |
|---------------|-------------------|--------------------|-------------------|----------------------|-------------------|
| | PPVT | BDS | H&F | ACES (Sit) | Angry Bias |
| Treatment | 0.019 (0.174) | 0.396** (0.193) | -0.122 (0.244) | 0.516** (0.232) | -0.012 (0.317) |
| SEL Treatment | 0.056* (0.032) | -0.025 (0.037) | -0.012 (0.049) | -0.011 (0.031) | 0.036 (0.050) |
| R^2 | 0.129 | 0.127 | 0.153 | 0.207 | 0.042 |
| Observations | 3222 | 2556 | 1993 | 2573 | 1917 |

Covariates: School Pairs Fixed Effects, Strata Fixed Effects, Assessors Fixed Effects, Grade Fixed Effects,

Violence, Students's age, gender and SSE.

Conclusions

- T_1 (information Intervention) has an impact of 0.1 on teacher's expectations.
 - ⇒ Taking a teacher from the 2nd decil of baseline expectation to the median expectation.
- Increased expectations get teachers to increase their socioemotional effort in 6% .
 - ⇒ Taking a teacher from the 1st decil of investment-ranking correlation to the mean/median.
- Treatment has direct impact on students' outcomes:
 - ⇒ Executive Function (BDS):from the 1st to the 4th decil.
 - ⇒ Non Cognitive Skills (ACES): from the 1st to the 2nd decil.
 - ⇒ More violent areas: reduced angry bias from mean to 1st decil.

Data-set Construction

```
57      * Juntando a base de professores limpa na Co-working
58      /*
59      use "$cow\y2_t_0.dta", clear
60      save "$base\y2_t_0.dta", replace
61      use "$cow\y2_t_1.dta", clear
62      save "$base\y2_t_1.dta", replace
63      */
64
65      use "$base\y2_t_0.dta", clear
66      merge 1:1 cdschool class using "$base\y2_t_1.dta"
67      rename _merge merge_0_1
68
```


Variables

```
70     * Criando um código para cada professor
71     egen teachercode = concat(cdschool class), punct(" ")
72     gen grade_3=(class=="3º ano")
73     gen treat_real=(treat&grade_3)
74
75     /* Parte 3 do questionário: quanta renda o professor acha que alunos
76     diferentes combinações de habilidades
77     cog e ncog receberão no futuro em dois casos: professores que focam
78     professores que focam em não cognitivo.*/
79
80     forvalues num=0(1)1{
81     **Prof Cog
82     gen xc_`num'=belief_p3_1_m1_`num' //alto cog alto ncog
83     gen zc_`num'=belief_p3_2_m1_`num' //alto cog baixo ncog
84     gen yc_`num'=belief_p3_3_m1_`num' //baixo cog alto ncog
85     gen wc_`num'=belief_p3_4_m1_`num' //baixo cog baixo ncog
86
87     **Prof Não- Cog
88     gen xn_`num'=belief_p3_1_m2_`num' //alto cog alto ncog
89     gen zn_`num'=belief_p3_2_m2_`num' //alto cog baixo ncog
90     gen yn_`num'=belief_p3_3_m2_`num' //baixo cog alto ncog
91     gen wn_`num'=belief_p3_4_m2_`num' //baixo cog baixo ncog
92     }
```

Variables

```
107 * Passando o log
108 forvalues num=0(1)1{
109   foreach var in xc_`num' zc_`num' yc_`num' wc_`num' xn_`num' zn_`num' yn_`num' wn_`num'{
110     qui sum `var'
111     gen tag_`var'_`num'=1 if `var'==r(min)
112     replace `var'=(`var'-r(min))/(r(max)-r(min))
113     replace `var'=`var'+1
114     replace `var'=ln(`var')
115   }
116
117
118 /* Função objetivo:  $y = A(h) (\theta^N)^\alpha (\theta^C)^{1-\alpha}$ 
119 Resolvendo o modelo temos:  $dy_{dthetaN} + dy_{dthetaC} = \gamma$  (1)
120  $dy_{dIC} = (1-\gamma)(1-\phi)$  (2)
121 */
122
123 *  $dy_{dthetaN}$  = prêmio financeiro médio dado para o não cognitivo (considerando os dois
124 tipos de professores)
125 gen  $dy_{dthetaN\_num'}=1/4*(xc\_num'-zc\_num'+yc\_num'-wc\_num'+xn\_num'-zn\_num'+yn\_num'-$ 
126  $wn\_num')$ 
127
128 *  $dy_{dthetaC}$  = prêmio financeiro médio dado para o cognitivo (considerando os dois tipos
129 de professores)
130 gen  $dy_{dthetaC\_num'}=1/4*(xc\_num'-yc\_num'+zc\_num'-wc\_num'+xn\_num'-yn\_num'+zn\_num'-$ 
131  $wn\_num')$ 
```

Variables

```
143 * Seria o  $\gamma^{\tau}$ 
144 gen gamma_t_`num' = dy_dthetaN_`num' + dy_dthetaC_`num'
145 qui sum gamma_t_`num'
146
147
148 * Padronizando  $\gamma$  para ficar entre 0 e 1
149 replace gamma_t_`num' = (gamma_t_`num' - r(min)) / (r(max) - r(min))
150
151 * dy_dIC = prêmio financeiro médio dado para o professor que foca no cognitivo
152 gen dy_dIC_`num' = -1/4 * (xn_`num' - xc_`num' + yn_`num' - yc_`num' + zn_`num' - zc_`num' + wn_`num' - wc_`num')
153 gen dy_dIN_`num' = 1/4 * (xn_`num' - xc_`num' + yn_`num' - yc_`num' + zn_`num' - zc_`num' + wn_`num' - wc_`num')
154
155 * Isolando  $\phi$  em (2) temos:
156 gen phi_t_aux_`num' = 1 - (dy_dIN_`num' / (1 - gamma_t_`num'))
157 gen phi_t_aux2_`num' = phi_t_aux_`num'
158 }
159
```

Variables

```
384   forvalues num=0(1)1{
385     * Criando a razão dos investimentos = razão do esforço nas práticas 2 a 2
386
387     gen S_`num'_ji=pi_`num'_j/pi_`num'_i
388
389     * Criando o ranking (três maneiras distintas) da razão dos investimentos = razão
390     esforço nas práticas 2 a 2
391
392     bysort cod_prof dentro: egen r1_S_`num'_ji = rank(S_`num'_ji), field
393     bysort cod_prof dentro: egen r2_S_`num'_ji = rank(S_`num'_ji), track
394     bysort cod_prof dentro: egen r3_S_`num'_ji = rank(S_`num'_ji), unique
395     bysort cod_prof dentro: egen r4_S_`num'_ji = rank(S_`num'_ji)
396
397     * Criando a diferença entre os rankings socioemocionais das práticas
398     gen p2_`num'_ji-p2_`num'_j-p2_`num'_i
399     la var p2_`num'_ji "Diferença entre ranking das práticas 2 a 2 em t=`num'"
400
401     gen razao p2_`num'_ji=p2_`num'_j/p2_`num'_i
402     la var p2_`num'_ji "Razão ranking das práticas 2 a 2 em t=`num'"
403
404
405     * Deixando os rankings no negativo, só para o maior ter maior número!
406     foreach var in r1 S_`num'_ji r3 S_`num'_ji r4 S_`num'_ji{
407       replace `var' = - `var'
408     }
409 }
```

Descriptive Statistics

```
293 gen dif_belief = phi_t_sample_1 - phi_t_sample_0
294
295 twoway (kdensity dif_belief if treat_belief==1) (kdensity dif_belief if treat_belief==0),
legend(lab(1 "Treatment") lab(2 "Control")) graphregion(color(white)) ytitle("") bgcolor(
none) xtitle("") title("Belief {stSerif}({it:phi}{sup:tau})") saving(
"$grafs/delta_belief.gph", replace)
296 graph export "$grafs/delta_belief.png", as(png) replace
297
298 xi: reg phi_t_sample_1 phi_t_sample_0 i.pair_belief, rob
299 predict belief_res, res
300
301 twoway (kdensity belief_res if treat_belief==1) (kdensity belief_res if treat_belief==0),
legend(lab(1 "Treatment") lab(2 "Control")) graphregion(color(white)) ytitle("") bgcolor(
none) xtitle("") title("Belief {stSerif}({it:phi}{sup:tau})") saving(
"$grafs/residuo_belief.gph", replace)
302 graph export "$grafs/residuo_belief.png", as(png) replace
...
```

Descriptive Statistics

```
293 gen dif_belief = phi_t_sample_1 - phi_t_sample_0
294
295 twoway (kdensity dif_belief if treat_belief==1) (kdensity dif_belief if treat_belief==0),
legend(lab(1 "Treatment") lab(2 "Control")) graphregion(color(white)) ytitle("") bgcolor(
none) xtitle("") title("Belief {stSerif} ({it:phi}{sup:{&tau}})") saving(
"$grafs/delta_belief.gph", replace)
296 graph export "$grafs/delta_belief.png", as(png) replace
297
298 xi: reg phi_t_sample_1 phi_t_sample_0 i.pair_belief, rob
299 predict belief_res, res
300
301 twoway (kdensity belief_res if treat_belief==1) (kdensity belief_res if treat_belief==0),
legend(lab(1 "Treatment") lab(2 "Control")) graphregion(color(white)) ytitle("") bgcolor(
none) xtitle("") title("Belief {stSerif} ({it:phi}{sup:{&tau}})") saving(
"$grafs/residuo_belief.gph", replace)
302 graph export "$grafs/residuo_belief.png", as(png) replace
...
```

Descriptive Statistics

```
416 * Motivação: ranking correlaciona com belief?
417
418 * Gráfico Correlação vs Prêmios financeiros
419 twoway (scatter corr_0_ji raw_dy_dthetaN_0) (lfit corr_0_ji raw_dy_dthetaN_0), xlabel(,
grid gmax) leg(off) ytitle("Investment-Ranking") xtitle("Non-Cognitive Wage Premium")
graphregion(color(white)) bgcolor(none) title("Adherence with Student's Non-Cognitive
Wage Premium") saving(corr_n, replace)
420
421 graph export "$grafsartigo/corr_wagethetan.png", as(png) replace
422
423
424 twoway (scatter corr_0_ji raw_dy_dIN_0) (lfit corr_0_ji raw_dy_dIN_0), xlabel(, grid gmax)
leg(off) ytitle("Investment-Ranking") xtitle("Non-Cognitive Wage Premium") graphregion(
color(white)) bgcolor(none) title("Adherence with Teacher's Non-Cognitive Wage Premium")
saving(corr_in, replace)
425
426 graph export "$grafsartigo/corr_wagein.png", as(png) replace
427
```

Results

```
490 reg phi t sample 1 treat belief phi t sample 0 i.pair belief, rob
491 estimates store itt
492 reg phi_t_sample_1 treat_belief phi_t_sample_0 i.pair_belief etnial under_educ, rob
493 estimates store itt2
494 bootstrap, reps(1000): reg phi_t_sample_1 treat_belief phi_t_sample_0 i.pair_belief, rob
495 estimates store itt3
496 bootstrap, reps(1000): reg phi_t_sample_1 treat_belief phi_t_sample_0 i.pair_belief etnial
    under_educ, rob
497 estimates store itt4
498
499 estout itt itt2 itt3 itt4, cells(b(fmt(3) star) se(fmt(3) par)) stats(r2 N) starlevels(*
    0.1 ** 0.05 *** 0.01)
500
```


Results

```
687 */
688
689 foreach var in corr b corr 0 b corr 1 b {
690   ivregress gmm `var'1_ji `var'0_ji phi_t_sample_0 i.pair_belief (phi_t_sample_1=
691   treat_belief)
692   estimates store iv1`var'
693
694   ivregress gmm `var'1_ji `var'0_ji phi_t_sample_0 i.pair_belief (phi_t_sample_1=
695   treat_belief) [aw=se`var'1_ji]
696   estimates store iv2`var'
697
698   ivregress gmm `var'1_ji `var'0_ji phi_t_sample_0 i.pair_belief etnial under_educ (
699   phi_t_sample_1=treat_belief)
700   estimates store iv3`var'
701
702   ivregress gmm `var'1_ji `var'0_ji phi_t_sample_0 i.pair_belief etnial under_educ (
703   phi_t_sample_1=treat_belief) [aw=se`var'1_ji]
704   estimates store iv4`var'
705
706   bootstrap, reps(2000): ivregress gmm `var'1_ji `var'0_ji phi_t_sample_0 i.pair_belief (
707   phi_t_sample_1=treat_belief)
708   estimates store iv5`var'
709
710   bootstrap, reps(2000): ivregress gmm `var'1_ji `var'0_ji phi_t_sample_0 i.pair_belief
711   etnial under_educ (phi_t_sample_1=treat_belief)
712   estimates store iv6`var'
713 }
714
715 estout iv1corr b iv2corr b iv3corr b iv4corr b iv5corr b iv6corr b , cells(b(fmt
716 (3) star) se(fmt(3) par)) stats(r2 N) starlevels(* 0.1 ** 0.05 *** 0.01)
717 estout iv1corr_1_b iv2corr_1_b iv3corr_1_b iv4corr_1_b iv5corr_1_b iv6corr_1_b_
718 , cells(b(fmt(3) star) se(fmt(3) par)) stats(r2 N) starlevels(* 0.1 ** 0.05 *** 0.01)
719 estout iv1corr_0_b iv3corr_0_b iv2corr_0_b iv4corr_0_b iv5corr_0_b iv6corr_0_b_
720 , cells(b(fmt(3) star) se(fmt(3) par)) stats(r2 N) starlevels(* 0.1 ** 0.05 *** 0.01)
721
722
```