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## ABSTRACT

### Experimental Evidence on the Long-Term Impacts of a Youth Training Program<sup>1</sup>

This paper presents the results of a randomized controlled trial on the long-term impacts of a youth training program. The empirical analysis estimates labor market impacts six years after the training – including long-term labor market trajectories of young people – and, to the best of our knowledge, is the first experimental long-term evaluation of a youth training program outside the US. We are able to track a representative sample of more than 3,200 youths at the six-year follow-up. Our empirical findings document significant impacts on the formality of employment, particularly for men, and impacts for both men and women in Santo Domingo, the capital of the Dominican Republic. The long-term analysis shows that these impacts are sustained and growing over time. There are no impacts on average employment, which is consistent with the low unemployment in countries with high informality and no unemployment insurance. Looking at the local labor market context, the analysis suggests that skills training programs work particularly well in more dynamic local contexts, where there is actual demand for the skills provided.

JEL Classification: J24, J64, O15, O17

Keywords: long-term, impact evaluation, randomized controlled trial, Dominican Republic, youth training, labor market outcomes

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## 1. Introduction

Investments in human capital are decisive for the economic success of individuals in the labor market. In developed and developing countries alike, however, there are disadvantaged groups in need of support to upgrade, modernize or simply build their skills. The fact of being disadvantaged can arise for several reasons, such as lack of access to education, or dropping-out of education; a history or background of poverty; and/or being unemployed and looking for a job. Job training programs of various types have been implemented in many countries to address issues of skills shortages, to help jobseekers find jobs, and to increase individual productivity and labor earnings.

A large number of program evaluation studies over the last decades have addressed the effectiveness of these training programs in terms of increasing participant earnings and employment probability (for systematic overviews of the evidence see Heckman et al. 1999, Greenberg et al. 2003, Betcherman et al. 2004, Kluve 2010, Card et al. 2010). A key result emerging from the overall evidence is that the timing of measuring program impacts matters: short-term effects during the first year post-program are often small or even negative, reflecting the “lock-in” nature of a skills-enhancing treatment. With increasing time between the end of the program and measurement of the effects, the size of the effects and their positive significance generally tends to increase. Card et al. (2010) e.g. show that medium- and long-run estimates of training impacts are more likely to be positive and significant than the shorter term estimates. One caveat of this finding is, however, that the number of available long-run estimates is small, and that the “long-run” is typically defined only as impacts measured more than 24 months after the program. Thus, the importance of the pattern notwithstanding, this type of evidence also implies that our knowledge on long-term impacts remains quite limited.

In fact, only very few studies of long-term impacts of training programs exist, such that there is little knowledge regarding the question whether the human capital investment contained in these – typically post-secondary – training programs has any significant returns over an extended time horizon. Our paper contributes to filling this knowledge gap by investigating the long-term effects of a youth training program using a Randomized Controlled Trial (RCT). The empirical analysis is based on experimental data tracing 3,279 young people six years after random assignment. Our study is

implemented in the Dominican Republic and covers a cohort of the training program *Juventud y Empleo* (i.e. “youth and employment”). A previous cohort of the previous version of the program served to evaluate the short-term impacts also using an RCT (Card et al. 2011), and short-term results for the training cohort serving for our long-term experiment are presented in Ibararán et al. (2014). To the best of our knowledge, our paper is the first experimental long-term impact evaluation of a youth training program outside the US, where a series of large-scale experimental evaluations investigated the impacts of the National Supported Work Demonstration in the 1970s, JOBSTART in the 1980s, and Job Corps in the 1990s.

We show and discuss the representativeness of our sample at the long-term follow-up and present intention-to-treat, average treatment, and local average treatment effect estimates of program impacts. We find persistent effects on the formality of employment, in particular for men, but not on overall employment. Young individuals in Santo Domingo, the capital, also benefit significantly in terms of labor earnings. The empirical results therefore suggest that the skills investment of the program may not bring about large overall impacts, but it has a significant impact on the probability of being formal and on labor earnings in an urban labor market. Moreover, the positive impacts found for subgroups are sustained and growing over time.

The paper is organized as follows. Section 2 reviews the literature on long-term impacts of training programs. Section 3 describes the *Juventud y Empleo* program, gives a summary of the previous findings on short-term impacts, and explains the experimental design and the long-term data collection. The empirical results are presented in section 4. Section 5 concludes.

## 2. Related literature

The evidence to date on the long-run effects of job training programs is quite limited and can be grouped into two types of studies. The first type of studies looks at job training programs in the US; these studies investigate impacts for the set of well-known US employment training programs that were evaluated using large-scale experimental designs. Evidence on long-term impacts has been produced

for the National Supported Work experiment (Couch 1992), the JOBSTART demonstration (Cave et al. 1993), and Job Corps (Schochet et al. 2008, Flores-Lagunes et al. 2010). A second type of studies looks at the long-run effects of training for the unemployed in Germany; these studies are based on administrative data, use non-experimental identification strategies and specifically focus either on East Germany (Fitzenberger and Völter 2007) or West Germany (Lechner et al. 2011, Osikominu 2012).<sup>2</sup>

Couch (1992) uses Social Security data to track annual earnings for the treatment and control groups in the National Supported Work (NSW) demonstration for 8 years following the end of the program. The NSW provided subsidized employment opportunities – essentially work experience and on-the-job training – to individuals “severely handicapped in the labor market” and operated experimentally at 10 sites across the US from 1975 to 1979. The study finds significant earnings impacts (in the range of USD 400 – 500 p.a.) for Aid to Families with Dependent Children (AFDC) recipients during the period 4 to 8 years after treatment, but does not find any significant earnings effects for the youth target group (sample sizes are not reported for both target groups). That is, for the entire 8-year post-program period 1979-1986 the annual earnings impact estimates for young individuals are close to zero in size and always insignificant, indicating that the program did not help this group into a better position in the labor market.

The JOBSTART demonstration was implemented between 1985 and 1988 in 13 sites and specifically aimed at providing evidence on what works for low-skilled, economically disadvantaged young people (Cave et al. 1993). The evaluation was based on an experimental design and the eligible population comprised 17- to 21-year old, economically disadvantaged school dropouts with poor reading skills. Individuals in the treatment group participated in education and vocational training, and also received job placement assistance; the total average duration of program activities amounted to 400 hours (with wide variation, however, cf. Cave et al. 1993). The impact evaluation uses a sample of 1,941 youths who were surveyed in the short- and medium-term (12, 24, and 48 months after random assignment).

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<sup>2</sup> Note that our review of the related literature focuses specifically on long-run impact studies. There is a large number of impact evaluations of (youth) training programs in developing and developed countries that estimate short-run effects; these are contained and discussed e.g in the reviews and meta-analyses provided by Heckman et al. (1999), Greenberg et al. (2003), Ibararán and Rosas (2009), Card et al. (2010), and Kluve (2010).

Whereas educational outcomes – i.e. the rates of passing the General Educational Development (GED) examination or completing high school – were significantly improved through the program, labor market outcomes were not enhanced: after the expected “lock-in” effect in the first year, during which youths in the experimental group earned less on average than those in the control group, towards the end of the survey period treatment group average earnings “appeared to overtake those of controls [..., but] the magnitude of these impacts was disappointing and they were not statistically significant according to the usual tests.” (Cave et al. 1993)

The Job Corps program, first established in 1964, is similar to JOBSTART but more intensive: disadvantaged youths between the ages of 16 to 24 received academic education, vocational training, and a wide range of other services (including counseling, life skills training, and health education) during an average period of 8 months (again varying widely) in a residential setting (Schochet et al. 2008). In a final step, placement services are also provided. Similar to the studies discussed above, the National Job Corps study used a large-scale experimental design to rigorously assess the impacts of Job Corps. For a total sample of 11,131 eligible youths that applied to the program between November 1994 and December 1995 – 6,828 and 4,485 of which were randomly assigned to the treatment and control group, respectively – survey data were collected at baseline and at 12-, 30-, and 48-month follow-up interviews. The empirical results indicate negative earnings impacts during the first 5 quarters after random assignment (the “lock-in” phase), before treatment group youths catch up with the control group and display significantly higher earnings during the 3<sup>rd</sup> and 4<sup>th</sup> year after random assignment.<sup>3</sup> This significant medium-term impact found in the survey data up until month 48 disappears, however, when looking at the long-term impacts (years 5 to 8 after random assignment) on earnings and employment probability using annual Social Security records (Schochet et al. 2008). Hence, despite the intensity of the Job Corps intervention, the long-term impacts appear to be small. This finding, however, has to be interpreted against the counterfactual of the evaluation, which is given by a randomized-out control group of youths who to a large extent were offered and took part in alternative training programs (ibid.).

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<sup>3</sup> This is not the case for all youths. Flores-Lagunes et al. (2010) find that Hispanic youth did not experience earnings gains like whites and blacks – despite similar increases in human capital – and show that this relates to the different (higher) levels of local labor market unemployment rates they face.

Hotz et al. (2006) analyze the impacts of California's Greater Avenues to Independence program (GAIN) for up to 9 years after random assignment. A key part of the evaluation of the GAIN program is an assessment of the relative effectiveness of alternative strategies for designing welfare-to-work training programs; essentially, one approach focuses on human capital development through education and vocational training, and a second approach focuses on labor force attachment through job search assistance. Different from the studies discussed above that assess long-term training impacts for disadvantaged youths, GAIN targeted adults on welfare, and contained a mandatory component (see Hotz et al. 2006 for details). The analysis finds that in the long run the human capital development approach yields higher employment rates for participants than the labor force attachment approach. Overall, however, the long-run experimental impact estimates (7-9 years) on employment rates are statistically significant from zero only for one of the four counties analyzed.

This evidence on long-run impacts of training programs in the US is complemented by three studies for Germany (Fitzenberger and Völter 2007, Lechner et al. 2011, Osikominu 2012). The studies use administrative data based on specific cohorts each: inflows into unemployment during 1993 and 1994 (Fitzenberger and Völter 2007), inflows into training for the unemployed from January 1992 to June 1993 (Lechner et al. 2011), and inflows into unemployment within the period July 1999 to December 2001 (Osikominu 2012). Given the non-experimental nature of the data, all three studies use econometrically involved variants of identifying treatment effects under unconfoundedness, i.e. selection-on-observables strategies. The results are generally encouraging: Fitzenberger and Völter (2007) find significantly positive long-run impacts – up to 7.5 years after start of the program – on participants' employment probability for a comprehensive classroom training program. Lechner et al. (2011) estimate treatment effects for up to 8 years after the end of the program and find significantly positive employment impacts for the more comprehensive training programs; in particular, the authors argue that these programs are relatively intense by international standards. Osikominu (2012) considers impacts for up to 5 years after registering as unemployed, and also finds the longer programs to be effective in creating stable employment spells and higher earnings.

In sum, the evidence on long-term impacts of job training programs is therefore quite limited and inconclusive. On the one hand, there is a series of studies for Germany using non-experimental



identification strategies on specific cohorts of registered unemployed and generally finding that training programs – at least the more intensive ones – have positive long-term labor market outcomes. These programs are not targeting specific age groups among the unemployed. On the other hand, a series of large-scale experimental studies in the US looks at the long-run impacts of youth training programs, and generally finds that these programs at best have very small long-term earnings impacts. This led some authors at the time to conclude that despite the efforts that went into the experimental evaluations there is no known way to make training programs for disadvantaged youths work (Bloom et al. 1997).

Our paper contributes to this debate by producing new evidence on the long-run impacts of a job training program. The intervention itself is less intensive than many training programs in developed countries, but constitutes a sizeable human capital input combining classroom training and on-the-job training for disadvantaged youths (see below). The key advantages of our study are that we can rely on experimental data, that we succeed in tracing a representative and comparatively large sample at the 6-year follow-up, that it is the first such study in a developing country (and, effectively, the first such study outside the US, and since the 1990s), and that we add new insights to a research question on which – as this section has shown – very little knowledge exists.

### 3. The *Juventud y Empleo* Program: random assignment and data collection

Youth labor market insertion represents a challenge for the majority of Latin American and Caribbean (LAC) countries. According to ILO (2014), one out of five young individuals are neither working nor studying, and among those who are employed more than half are in the informal sector. To address this situation, LAC governments have a long tradition of implementing programs that offer short-term job training services to youths living in urban areas. These programs are supposed to offer training that responds to the skills needs of the productive sector (Ibarraran and Rosas 2009, Gonzalez et al. 2012). The interventions combine technical skills training (of approximately three months) in lower-skilled professions with a subsequent internship period to provide on-the-job work experience (of around three months). The majority of the programs also comprise a short component of soft skills training.

There is some evidence about the short-term impacts of these training interventions. In general, the existing impact evaluations find zero or modest impacts on overall employment, but positive impacts on job quality (formal employment) and earnings. Also, the evidence suggests large heterogeneity in results by gender (Ibarrarán and Rosas 2009, Urzúa and Puentes 2010, Gonzalez et al. 2012). These results differ from those for similar programs in developed countries, where, first, youth training programs rarely show any positive impacts at all, and second, impact estimates generally do not differ by gender (Card et al. 2010).

Since 2001, the Dominican Republic has been implementing one of the previously described programs, which is named *Juventud y Empleo* (“youth and employment”). The *Juventud y Empleo* program has been rigorously evaluated in the past, because it considered an experimental design since its inception (Card et al. 2011). This emphasis on rigorous impact evaluation is striking in LAC, since few randomized controlled trials to evaluate social policies or labor programs exist. Also, the program has been characterized by using the findings from earlier evaluations to introduce improvements in its conceptual and operative design.

*Juventud y Empleo* targets youths between 16 to 29 years of age that are living in poor neighborhoods and that are not attending school. Other targeting criteria are that they should have, at most, incomplete high school education; and they should be unemployed, under-employed or occupationally inactive at the moment of the registration in the program; and hold a Dominican identity card. The program offers skills training courses that last 225 hours: 150 hours devoted to teach a wide range of low-skill qualifications, such as administrative assistant, hair stylist, or mechanic; and 75 hours devoted to improve the soft skills of participants (mainly, work habits and self-esteem). Courses are followed by a three-month period internship in a private firm. Both the registration of beneficiaries and the identification of firms are the responsibility of private training institutions (*Centros Operativos del Sistema*, COS) that have been previously approved by the national training institution (INFOTEP for its acronym in Spanish). Participants receive a monetary stipend of around US\$3 per day from the government during both phases of the program. They also receive an insurance against workplace accidents.

### 3.1 Previous evaluations

Juventud y Empleo is the first labor training program with an experimental impact evaluation in LAC. Card et al. (2011) estimate program effects using a sample of youth that applied to the program in 2004. Follow-up data were collected in 2005, approximately 10-14 months after trainees had finished the program. No impacts on employment but a modest positive impact on wages and formality for men were found. The evaluation had a relatively small sample and a few other limitations. In particular, compliance was imperfect: 17.4 per cent of youths randomly assigned to training did not show up for the course. Moreover, the no-show behavior was selective and the study did not collect follow-up data for the no-show group. In addition, 36.7 per cent of youths originally assigned to the control group were re-assigned to the treatment group to replace the no-shows. Whereas, clearly, such a replacement procedure can be implemented rigorously by randomly assigning control group units as replacements – as we do in the current study (see section 3.2) – in that first evaluation the training institutions were allowed to choose the replacements, and they did so in a selective manner (Card et al. 2011).

A second evaluation of the program was performed by Ibararán et al. (2014), again focusing on short-term effects of the program, but using a later cohort of participants. Specifically, the cohort under study in the second evaluation comprises youths who registered in the COS training centers in 2008, and follow-up data were collected between November 2010 and February 2011, some 18-24 months after participants had finished their course. In light of the experiences made in the first evaluation, the study is based on an improved procedure of random assignment and data collection that also forms the basis of our analysis (section 3.2).

The results of the evaluation are mixed; as in the first study, program impacts on overall employment are negligible but there is an impact on job quality for men. Specifically, the impact on the probability of formal employment for males is a 17 per cent increase. Moreover, the study finds a positive impact of 7 per cent on monthly earnings, conditional on being employed. Both of these impacts are stronger in Santo Domingo, the capital. Looking at secondary outcomes, the study finds positive impacts on participants' perceptions and expectations about the future, particularly for women. The program also

has an impact on the development of soft skills, mainly in the following dimensions: leadership skills, persistency of effort, and conflict resolution (Ibarrarán et al. 2014).

Despite the fact that the second evaluation managed to solve the methodological problems of the first impact study, estimates of the short-term effects only provide limited information on the program's effectiveness. First, it is imperative to investigate whether the overall relatively modest effects as well as the stronger effects for some subgroups are sustained in the long run. Second, this is particularly interesting against the background of the generally disappointing results on long-term impacts for youth training programs in developed countries (recall section 2). And third, it is important to assess long-term impacts specifically in LAC, since the series of youth training programs in the region has been generally perceived as a success, even though this conclusion is derived from short-term impact estimates only.

### 3.2 Random assignment and survey implementation

The evaluation design of the Juventud y Empleo program is strongly linked to its targeting method. In the first stage, for each training course they offer, the COS training centers identify 35 young people that meet the eligibility criteria described above. In the second stage, the Juventud y Empleo Program Coordination Unit (PCU; *Unidad Coordinadora de Programas*) receives the information about the youths that registered for the course from the COS training centers and proceeds to verify that none of the applicants has registered before. In the third step, the program runs a lottery in which each of the 35 youths is randomly assigned to one of two groups. The first one is formed by 20 youths who are invited to attend the training course and the second one by 15 youths who are assigned to the control group; their identification numbers are locked in order to guarantee that they will not be registered again in the case of any other attempt.

If any of the 20 youths assigned to the treatment group gives no response when called to attend the course or if they drop out before the tenth day of classes, the COS may replace up to 5 slots with

youths from the control group. This group of five people is again randomly selected out of the 15 in the control group by the PCU, who provides the names of the up to five replacements directly to the COS.<sup>4</sup> Hence, given this procedure and the initial configuration of random assignment to treatment and control groups, we can define four groups in the data: (A) the *beneficiaries*: those who were randomly assigned to the treatment group and actually attend and complete the course, (B) the *no-shows*: those who were randomly assigned to the treatment group but fail to show up or fail to complete at least two weeks of the course, (C) the *replacements*: those who were randomly assigned to the control group and then randomly chosen to replace no-shows in the training course, (D) the *controls*: those who were randomly assigned to the control group.

The data for the long-term impact evaluation were collected in three waves, one baseline survey at random assignment in 2008 and two follow-up surveys: the short-term follow-up survey between November 2010 and February 2011 (18 to 24 months after graduating from the program), and the long-term follow-up survey between September and December 2014 (six years after the treatment). Both follow-up surveys were administered using comprehensive face-to-face interviews (the full questionnaires are available upon request). It has to be emphasized that substantial effort went into tracking youths at the long-term follow-up, using all resources available (family, friends, neighbors) to establish contact and make possible the interview.<sup>5</sup>

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<sup>4</sup> This procedure solves a problem that is not uncommon in randomized trials of training or similar programs: typically some share of the units assigned to the treatment group may not show up or drop out very early, while at the same time strong incentives may exist to fill all available slots (e.g. if the program implementing institution is paid to serve a certain number of people). It is then crucial to avoid a non-random process of filling-up the free slots with control group units, e.g. as happened in the first Juventud y Empleo study, when the training institutions themselves selected the replacements, biasing both treatment and control groups (Card et al. 2011). A related approach is the “waitlist” procedure used e.g. in Hirshleifer et al. (2014), in which eligible units are assigned to treatment group, control group or waitlist, and implementing institutions can replace no-shows choosing units from the waitlist. While the waitlist units are excluded from the analysis (as their selection into training is non-random), the advantage of the procedure is that it maintains a valid control group. Our procedure has the additional advantage that also the replacements can be included in the analysis, since they are randomly drawn from the control group – this was feasible because, if replacements were needed, it could be put into practice very quickly at the COS training course level (i.e. the cell of 35 eligible youths).

<sup>5</sup> Data collection proceeded using several incentives and instruments for quality assurance. For instance, external advisors were hired to supervise the field experiment, and the data processing system was implemented using the Computer Assisted

At baseline in the year 2008, 10,309 eligible applicants were randomly assigned to 5,914 treated and 4,395 control units. Following the (expected) occurrence of no-shows and the replacement procedure delineated above, the eventual distribution of the entire baseline sample into the four groups was as follows: (A) 4,937 beneficiaries, (B) 977 no-shows, (C) 977 replacements, (D) 3,418 controls. The short-term follow-up targeted a random sample of 5,000 out of the 10,309 young people who had initially registered.<sup>6</sup> This target sample had 3,250 individuals from the treatment group and 1,750 from the control group. From this sample, 4,033 individuals were found and interviewed, 2,626 of the treatment group and 1,407 of the control group (Ibarrarán et al. 2014). These formed the target sample for our long-term follow-up in 2014: From the 4,033 individuals interviewed in 2010, 3,279 were found and have complete surveys: 2,163 individuals in the treatment group and 1,116 in the control group (as initially assigned). In sum, in both follow-up surveys about 80 percent of the sample were located at their households, and this percentage was balanced between treatment and control groups.

If  $Z_i$  represents the random assignment of each youth  $i$  ( $Z_i = 1$  assigned to the treatment group and  $Z_i = 0$  assigned to the control group) and  $D_i$  the final treatment status ( $D_i = 1$  attended the course and  $D_i = 0$  do not), Table 1 shows the distribution of the long-term follow-up between the four groups in 2014.

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Field Editing (CAFÉ) methodology. A system of double entry was used in 20 per cent of the cases to ensure that the CAFÉ methodology was working as expected. Finally, monetary incentives of RD\$600 (around 15 dollars) per respondent were offered in order to minimize attrition.

<sup>6</sup> The sample size was set at 5,000 to detect an 8 percent increase in income with a power of 0.8 and an attrition of 30 percent of the sample.

**Table 1. Participants by lottery assignment and treatment status, long-term follow-up sample**

	Selected in the Lottery, $Z_i=1$	Not selected in the Lottery, $Z_i=0$
Participated in the program, $D_i=1$	Group A: Beneficiaries, N=1,901	Group C: Replacements, N=438
Did not participate in the program, $D_i=0$	Group B: No-shows, N=262	Group D: Controls, N=678

Sources: 2014 long-term follow-up survey.

### 3.3 Identification strategy and data

Given the randomized experiment described above, the first step in our analysis is to estimate the causal effect of  $Z_i$  on labor market outcomes using an Intention to Treat (ITT) analysis, i.e. a linear regression of the outcome on  $Z_i$ . This approach uses the full sample of treatment (A and B) and control group units (C and D). Since youths in the replacements group were eventually randomly selected to take part in the course, we also estimate Average Treatment on the Treated (ATT) effects that compare the combination of the groups A and C – both of which effectively received the treatment – with the group D as control group (i.e. the “pure” randomized-out control units). In both cases, the regressions include fixed effects for training institutions COS, and robust standard errors are computed using clusters defined by the course within which randomization took place. Finally, we also estimate the Local Average Treatment Effects (LATE), in which participation is instrumented by randomization status.

Ibarrarán et al. (2014) show that the complete cohort ( $N=10,305$ )<sup>7</sup> as well as both the target sample ( $N=5,000$ ) and the realized sample ( $N=4,033$ ) at short-term follow-up are balanced in baseline characteristics of the treatment and control groups. Table 2 validates the long-term follow-up and

<sup>7</sup> The complete cohort of 10,305 individuals comes from the original randomization group of 10,309, but taking out four individuals that did not have identification numbers.

shows that, at baseline, there are no significant differences between the long-term follow-up sample (N=3,279) and the rest of the sample (N=7,026). As shown, the characteristics of the sample that we track in 2014 are statistically equivalent to the rest of the 2008 training cohort. The same holds if we focus on differences at baseline between the 2014 sample and the rest of the sample within the treatment and control groups.<sup>8</sup>

After having shown that the long-term follow-up sample is representative of the complete cohort, we proceed to show that, within the 2014 sample, there is balance in the characteristics of treated and control youths (as defined by the lottery) as well as between participants and non-participants. That is, using the definition of the four groups presented above, Table 3 shows the mean characteristics for each of the groups defined by the assignment/participation matrix (Table 1), as well as for the groups defined by the lottery (AB vs CD) and by participation (AC vs D). The results show that balance is maintained in the 2014 sample. In the first comparison (based on the results of the lottery) there is only one unbalanced variable out of 25, and in the second comparison (based on participation) there are only two unbalanced variables (but only at the 10% significance level). In sum, these tables show that the long-term follow-up data are representative of the whole cohort, and that the data are balanced between the four subgroups defined by lottery assignment and participation, essentially also validating the replacement procedure.

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<sup>8</sup> The tables showing the descriptive statistics within treatment and control groups at baseline for the 2014 sample and the rest are available upon request. They find the same results in terms of balancing as the overall sample shown in table 2. As a robustness check, and additional validation of the long-term follow-up sample, we re-estimated the regressions for the short-term analysis in Ibararán et al. (2014) restricting the sample to the 3,279 observations with complete long-term data in 2014, and the results remain essentially unchanged.



**Table 2. Representativeness of the long-term follow-up sample, characteristics at baseline**

	Mean		P-value
	Sample 2014=0	Sample 2014=1	
Age	21.54	21.51	0.61
Age 16-19	0.35	0.35	1.00
Age 20-24	0.43	0.44	0.49
Age >24	0.22	0.21	0.41
% Women	0.63	0.62	0.41
% Married	0.03	0.03	0.70
Number of people in HH	4.36	4.53	0.00
Number of children	0.70	0.70	0.88
% Currently attending school	0.22	0.24	0.03
Fraction with prior work experience	0.16	0.17	0.46
Worked during last 2 years	1.79	1.79	0.79
Rosenberg	23.93	23.98	0.59
Urban areas	0.90	0.88	0.04
Lives in Santo Domingo	0.25	0.23	0.02
Receives remittances	1.89	1.90	0.43
Owens home	0.06	0.06	0.20
Concrete, brick or wood walls	0.97	0.97	0.54
Concrete or zinc ceilings	1.00	1.00	0.22
Cement, ceramic or wood floors	0.98	0.98	0.94
% connected to aqueduct	0.50	0.49	0.39
% Proper sanitation	0.99	0.99	0.31
% Garbage collection	0.83	0.85	0.07
% Refrigerator	0.71	0.72	0.41
% TV	0.88	0.88	0.76
% Wash Machine	0.72	0.72	0.61
% Car	0.14	0.15	0.30
% AC	0.02	0.02	0.99
% Computer	0.09	0.08	0.59
% Electricity Generator	0.08	0.09	0.75
Observations	7,026	3,279	10,305

Sources: Long-term follow-up survey, baseline survey.

Notes: The “Sample 2014=1” group denotes the long-term follow-up sample available for our analysis. The “Sample2014=0” group comprises the remaining observations from the full cohort of 10,305 youths that formed part of the random assignment in 2008.

**Table 3. Baseline characteristics of subgroups defined by lottery assignment and participation: long-term follow-up sample**

Characteristic	Mean							P-value	
	A	B	C	D	AB	CD	AC	AB/CD	AC/D
Age	21.99	22.27	21.79	22.03	22.03	21.94	21.96	0.470	0.604
Age 16-19	0.19	0.19	0.22	0.22	0.19	0.22	0.20	0.050	0.170
Age 20-24	0.53	0.54	0.54	0.50	0.53	0.52	0.53	0.292	0.116
Age >24	0.27	0.27	0.24	0.28	0.27	0.26	0.27	0.555	0.601
% Women	0.62	0.65	0.59	0.63	0.63	0.61	0.62	0.511	0.645
% Married	0.24	0.24	0.25	0.23	0.24	0.23	0.24	0.603	0.360
Number of people in HH	4.50	4.49	4.45	4.64	4.50	4.56	4.49	0.341	0.071
Number of children	0.69	0.80	0.63	0.73	0.70	0.69	0.68	0.783	0.230
Currently attending school	0.25	0.21	0.24	0.24	0.24	0.24	0.25	0.898	0.823
Incomplete elementary	0.19	0.21	0.18	0.20	0.19	0.19	0.19	0.938	0.493
Complete elementary	0.05	0.04	0.04	0.06	0.05	0.05	0.05	0.874	0.573
Incomplete high school	0.58	0.56	0.55	0.58	0.58	0.57	0.57	0.612	0.892
Complete high school	0.04	0.03	0.04	0.03	0.03	0.03	0.04	0.966	0.295
More than high school	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.401	0.235
Missing education	0.04	0.04	0.04	0.03	0.04	0.04	0.04	0.991	0.750
No data on education	0.10	0.12	0.14	0.10	0.10	0.12	0.11	0.202	0.651
Prior work experience	0.17	0.19	0.16	0.16	0.17	0.16	0.17	0.365	0.603
Currently employed	0.04	0.04	0.06	0.04	0.04	0.05	0.04	0.224	0.912
Currently salaried worker	0.01	0.01	0.02	0.02	0.01	0.02	0.01	0.225	0.241
Currently unemployed	0.52	0.55	0.50	0.51	0.53	0.51	0.52	0.417	0.810
ICV Score (0 to 100)	62.66	62.70	63.25	62.29	62.66	62.66	62.77	0.993	0.288
Rosenberg	24.00	23.89	24.09	23.73	23.99	23.87	24.02	0.385	0.075
Urban areas	0.89	0.87	0.86	0.90	0.88	0.88	0.88	0.944	0.117
Lives in Santo Domingo	0.31	0.30	0.28	0.32	0.31	0.31	0.31	0.662	0.603
Receives remittances	0.11	0.08	0.10	0.11	0.10	0.11	0.10	0.806	0.551
Observations	1,901	262	438	678	2163	1,116	2,339		

Sources: Long-term follow-up survey.

Notes: Groups as defined by lottery assignment and participation: A = beneficiaries, B = no-shows, C = replacements, D = controls. See also section 3.2 and Table 1. AB = treatment group according to random assignment, CD = control group according to random assignment; these groups are used to identify ITT program effects. AC = all youths that actually received the treatment, AC vs. D used to identify ATT program effects.

Table 4 displays sample characteristics and raw outcomes at the time of the long-term follow-up in 2014. Again, we group the data based on the subgroups defined above, to illustrate the summary statistics in relation to the two alternative identification strategies: the first based on the results from the lottery (AB vs CD, the ITT), and the second considering actual participation in the program (AC vs D, the ATT). Table 4 shows that the age at the time of the long-term follow-up is 28 years on average, so the group is at the higher end of the youth age range (if we consider youths as individuals that are between 15 and 29 years of age), entirely in line with the timing of the survey six years after random assignment.

Half of the sample is married (in contrast with 20 per cent at baseline), and about 32 per cent are heads of household. Looking at gender separately, the respective probabilities for men and women to be married at the long-term follow-up are 0.41 and 0.56, and to be head of household the probabilities are 0.42 for men and 0.25 for women. In terms of demographics, the only statistically significant difference is in marital status, and this is due to a higher share of males being married in the treatment group: those males assigned to participate in the program (AB) and those that completed the program (AC) were more likely to be married in 2014 than those in the control group. A plausible mechanism for this result is the positive impacts in terms of quality of employment (which will be explored below) that may in turn impact positively the probability of getting married.

Looking at raw outcomes, overall there is little indication of statistically significant differences in the comparison of the groups assigned to treatment vs. assigned to control, and actual participation vs. control. The average employment rate is 73 per cent, with no statistically significant differences across those randomly assigned to training (AB vs CD) or across treatment participants and controls (AC vs D). The employment rate is higher for men than for women, and it is overall substantially higher than at the short-term follow-up in 2010 (when it was around 62 per cent). In part this can be explained already by an upward sloping employment-age profile that would be expected in general; and specifically against the background of high levels of informality in the Dominican labor market, generating pressure on youths to look for work. We will explore these employment patterns further when we look at the long-term labor market trajectories of the treatment and control groups in section 4.2.

Regarding the characteristics of employment, almost 90 per cent of young individuals work in services, and the average tenure on the job is about 20 months (with a slightly longer tenure for those selected in the lottery). About 56 per cent have a permanent job (but only 21 per cent have a written contract), 44 per cent are salaried workers and 22 per cent work at large firms. About half of the workers express their desire to change their current job, but only 19 per cent were seeking for another job at the time of the survey. Average monthly labor income (calculated with zero earnings for those not working) is RD\$5,300, the equivalent of USD\$120.

**Table 4. Sample characteristics and raw outcomes at long-term follow-up**

Characteristic/Outcome	Mean				P-value	
	AB	CD	D	AC	AB/CD	AC/D
Age	27.93	27.94	28.00	27.89	0.94	0.48
% Women	0.62	0.63	0.63	0.62	0.48	0.37
% Head of Household (all)	0.34	0.30	0.35	0.31	0.04	0.03
% Head of Household (women)	0.26	0.25	0.28	0.25	0.52	0.53
% Head of Household (men)	0.46	0.40	0.50	0.40	0.03	0.01
% Married	0.50	0.50	0.49	0.50	0.97	0.40
% Currently attending school	0.20	0.22	0.20	0.22	0.25	0.34
Years of education	11.48	11.53	11.29	11.60	0.66	0.01
Employed (women)	0.66	0.65	0.64	0.65	0.41	0.61
Employed (men)	0.86	0.86	0.87	0.85	0.80	0.52
Employed (all)	0.74	0.72	0.72	0.73	0.34	0.82
Agriculture and mining	0.02	0.02	0.01	0.02	0.57	0.45
Industry	0.10	0.08	0.11	0.08	0.05	0.01
Services	0.88	0.90	0.87	0.90	0.04	0.03
Duration of current job (months)	21.03	18.67	20.52	19.26	0.03	0.34
Permanent job	0.57	0.56	0.55	0.57	0.65	0.28
Employed at large firms	0.21	0.22	0.22	0.22	0.39	0.87
Salaried workers	0.44	0.44	0.42	0.45	0.75	0.25
Unpaid workers	0.01	0.01	0.01	0.01	0.40	0.88
Self-employed	0.22	0.22	0.22	0.22	0.77	0.87
Workers w/labor risk insurance	0.11	0.13	0.11	0.13	0.11	0.07
Workers w/ health insurance	0.25	0.28	0.24	0.28	0.12	0.02
Workers w/written contract	0.20	0.21	0.19	0.22	0.34	0.13
Weekly worked days	5.72	5.75	5.79	5.72	0.59	0.34
Weekly worked hours	29.31	28.42	28.85	28.85	0.35	1.00
Wants to work more hours	0.47	0.47	0.47	0.47	0.70	0.83
Wants to change current job	0.55	0.52	0.53	0.54	0.08	0.78
Workers seeking another job	0.21	0.19	0.20	0.19	0.21	0.79
Monthly wage (Dominican peso)	5357.84	5285.06	4999.80	5417.94	0.75	0.12
Hourly wage (Dominican peso)	37.44	39.78	34.57	40.16	0.46	0.14
Observations	2,163	1,116	678	2,339	3,279	3,017

Source: 2014 long-term follow-up survey.

Notes: Outcomes are not conditional on employment status.

a: Large firms are those that employ 51 or more employees.

b: One Dominican Peso = 0.0228 US Dollar (November 2014)

Groups as defined by lottery assignment and participation: A = beneficiaries, B = no-shows, C = replacements, D = controls. See also section 3.2 and Table 1. AB = treatment group according to random assignment, CD = control group according to random assignment; these groups are used to identify ITT program effects. AC = all youths that actually received the treatment, AC vs. D used to identify ATT program effects.

## 4 Empirical results

### 4.1 Long-term impacts

Tables 5 through 7 present the long-term impact estimates of the Juventud y Empleo job training program on labor market outcomes, using the experimental design described in the previous section. It is important to recall that the sample is representative for the young people that this program serves, and that the large sample size at the six-year long-term follow-up and the virtue of random assignment allows to provide precise estimates of the intervention effects. It is also worth noting that Juventud y Empleo is not a pilot program, but has been running for more than a decade as a publicly funded active labor market program in the Dominican Republic.

The results tables 5 and 6 (displaying ITT and ATT estimates, respectively) show several patterns. First, the overall average impacts on employment and earnings in the long-run remain close to zero in size and insignificant. Second, there is heterogeneity in the impact estimates, indicating, in particular, significant treatment-control differences for several stratifications of the sample population by socio-demographic characteristics. One key result is that there is a positive long-term impact of the program on the quality of employment for men, as measured by the job characteristic “employed with health insurance” (7.8 percentage points, i.e. an impact of 25 per cent).<sup>9</sup> This finding implies a sustained positive impact on formality that is consistent with and continues what was found in the short-run evaluation: in the first follow-up the impact was significant and of smaller magnitude (17 per cent).

The long-term impact is largest in Santo Domingo, where there is also an important impact for women. The overall point estimate of 7.3 percentage points in Santo Domingo, representing an impact of 31 per cent, is higher in the case of men (11.8 percentage points) than for women (6.3 percentage points), though in relation to the mean outcomes of controls (19.1 for females, 33.3 for males) the per cent increase is similar. In Santo Domingo, there is also a positive effect on the probability of having a

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<sup>9</sup> Having a job with health insurance or written contract are considered here as proxies of formality. Given the high informality rates in the Dominican Republic, having a formal job makes a very big difference in the career path of young people.

**Table 5. Long-term impacts of the “Juventud y Empleo” training program on labor market outcomes: ITT**

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Outcome	All	Women	Men	Santo Domingo	Santo Domingo women	Santo Domingo Men	Age 16-21	Age >21
<i>Employed</i>	-0.0143 (0.0152)	-0.0162 (0.0222)	0.0028 (0.0192)	0.0250 (0.0315)	0.0345 (0.0423)	0.0203 (0.0453)	-0.0035 (0.0224)	-0.0256 (0.0239)
Mean control group	0.740	0.665	0.860	0.719	0.658	0.838	0.739	0.741
<i>Employed with health insurance</i>	0.0256 (0.0158)	0.0001 (0.0201)	0.0802*** (0.0278)	0.0732*** (0.0276)	0.0625* (0.0326)	0.1176* (0.0632)	0.0227 (0.0249)	0.0178 (0.0228)
Mean control group	0.254	0.220	0.309	0.240	0.191	0.333	0.295	0.210
<i>Employed with written contract</i>	0.0173 (0.0141)	0.0110 (0.0176)	0.0383 (0.0259)	0.0441* (0.0246)	0.0318 (0.0296)	0.0744 (0.0523)	0.0211 (0.0219)	0.0033 (0.0197)
Mean control group	0.200	0.163	0.258	0.196	0.164	0.256	0.232	0.164
<i>Monthly earnings</i>	-99.7006 (222.9148)	82.1841 (221.2317)	-91.8111 (477.2564)	299.6451 (391.4541)	913.9499** (371.6096)	-292.7177 (935.1086)	44.4220 (311.1643)	-312.0953 (337.2968)
Mean control group	5358	3772	7888	5519	3692	9031	5549	5145
<i>Ln Monthly earnings</i>	0.0166 (0.0396)	-0.0081 (0.0600)	0.0631 (0.0542)	-0.0333 (0.0817)	0.0234 (0.1259)	-0.0633 (0.1064)	0.0631 (0.0554)	-0.0290 (0.0616)
Mean control group	8.701	8.498	8.930	8.784	8.531	9.111	8.743	8.654
<i>Labor force participation</i>	-0.0030 (0.0115)	-0.0049 (0.0182)	0.0060 (0.0101)	0.0287 (0.0205)	0.0398 (0.0305)	0.0119 (0.0173)	0.0041 (0.0161)	-0.0100 (0.0176)
Mean control group	0.883	0.832	0.963	0.877	0.831	0.966	0.879	0.887
Observations	3,279	2,041	1,238	1,020	677	343	1,729	1,549

Notes: Regressions use the full sample of groups A and B (treated) and C and D (controls). All specifications control for training institutions (COS) and region (10 “regiones”). Standard errors in parentheses. Significance levels are indicated by \*10%, \*\*5%, and \*\*\*1%.

**Table 6. Long-term impacts of the “Juventud y Empleo” training program on labor market outcomes: ATT**

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Outcome	All	Women	Men	Santo Domingo	Santo Domingo women	Santo Domingo Men	Age 16-21	Age >21
<i>Employed</i>	0.0033 (0.0182)	0.0148 (0.0255)	-0.0103 (0.0231)	0.0313 (0.0364)	0.0575 (0.0476)	-0.0261 (0.0509)	-0.0030 (0.0266)	0.0183 (0.0279)
Mean control group	0.724	0.641	0.865	0.705	0.635	0.855	0.737	0.711
<i>Employed with health insurance</i>	0.0437** (0.0194)	0.0273 (0.0240)	0.0816*** (0.0314)	0.0861** (0.0342)	0.0969** (0.0398)	0.0639 (0.0683)	0.0360 (0.0290)	0.0488* (0.0249)
Mean control group	0.237	0.202	0.298	0.221	0.162	0.348	0.286	0.187
<i>Employed with written contract</i>	0.0260 (0.0169)	0.0178 (0.0207)	0.0449 (0.0284)	0.0447 (0.0292)	0.0407 (0.0360)	0.0315 (0.0566)	0.0224 (0.0266)	0.0172 (0.0226)
Mean control group	0.189	0.155	0.246	0.189	0.155	0.261	0.225	0.151
<i>Monthly earnings</i>	387.6807 (268.7737)	304.0351 (276.8782)	622.0150 (535.6966)	1,029.5949** (477.5475)	1,059.2345** (456.7620)	1,124.5911 (1,166.3988)	557.4660 (351.6033)	142.6572 (389.7139)
Mean control group	5000	3599	7368	4879	3443	7961	5213	4778
<i>Ln Monthly earnings</i>	0.0451 (0.0516)	0.0056 (0.0786)	0.1120* (0.0647)	0.0466 (0.1031)	0.1082 (0.1612)	0.0426 (0.1072)	0.0829 (0.0660)	-0.0240 (0.0788)
Mean control group	8.677	8.492	8.889	8.725	8.479	9.050	8.728	8.621
<i>Labor force participation</i>	0.0127 (0.0137)	0.0162 (0.0206)	0.0030 (0.0131)	0.0384 (0.0244)	0.0485 (0.0312)	0.0070 (0.0255)	0.0195 (0.0206)	0.0115 (0.0190)
Mean control group	0.872	0.819	0.960	0.866	0.824	0.957	0.867	0.877
Observations	3,017	1,872	1,145	938	625	313	1,601	1,415

Notes: Regressions use the sample of groups A and C (treated) and D (controls). All specifications control for training institutions (COS) and region (10 “regions”). Standard errors in parentheses. Significance levels are indicated by \*10%, \*\*5%, and \*\*\*1%.



written contract – another measure of formality – of 23 per cent. This impact is significant at the 10 per cent level and measured for men and women together. Overall, the long-term impacts are substantial and show that the program has an important effect in helping youth get and keep good jobs. Table 5 also shows that, in Santo Domingo, there is a statistically significant impact on the earnings for women, representing a substantial increase of 25 per cent in the treatment group over the control group.

The results of estimating the ATT impacts (Groups A and C vs. D) shown in Table 6 are consistent with the findings from the ITT analysis. There is an important impact on formality (measured by having employer provided health insurance, in the order of 18 per cent), which is particularly strong for men (27 per cent) and in Santo Domingo (39 per cent over the mean of the control group). In this specification, the impact for men is not concentrated in Santo Domingo, where women do have a very large impact (9.7 percentage points or 60 per cent over the mean of the control group). The impact on earnings in Santo Domingo, in particular for women, is also statistically and economically meaningful, of about 30 per cent. In the case of men the point estimate is similar, but the sample is much smaller and the percentage difference relative to the control group is also smaller (14 per cent, not statistically significant).

Finally, we report the results from a LATE analysis in Table 7, using the random assignment as instrument for participation. As expected, the coefficients are larger than in the ITT analysis shown in Table 5, by a factor of close to two (LATE coefficients are the result of dividing the ITT coefficients by the difference between participation of lottery winners – approximately 87 per cent – and the participation rate of those who did not win the lottery – about 40 per cent). Statistical significance is largely unchanged, and the interpretation is that for those that participated in the program due to the lottery, the impact on formality is substantial. In the case of men, the impact is in the order of 17 percentage points, which represents an increase of about 52 per cent over the mean outcome of the control group. This difference is even stronger in Santo Domingo, representing a 26 percentage point or 70 per cent increase in formality.

**Table 7. Long-term impacts of the “Juventud y Empleo” training program on labor market outcomes: LATE estimates**

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Outcome	All	Women	Men	Santo Domingo	Santo Domingo women	Santo Domingo Men	Age 16-21	Age >21
<i>Employed</i>	-0.0296 (0.0311)	-0.0325 (0.0438)	0.0061 (0.0400)	0.0485 (0.0599)	0.0627 (0.0747)	0.0449 (0.0967)	-0.0074 (0.0465)	-0.0517 (0.0471)
Mean control group	0.733	0.649	0.878	0.736	0.655	0.899	0.741	0.725
<i>Employed with health insurance</i>	0.0531* (0.0322)	0.0002 (0.0395)	0.1724*** (0.0588)	0.1424*** (0.0516)	0.1137** (0.0573)	0.2603** (0.1327)	0.0485 (0.0518)	0.0361 (0.0448)
Mean control group	0.243	0.198	0.319	0.234	0.170	0.364	0.293	0.191
<i>Employed with written contract</i>	0.0358 (0.0288)	0.0221 (0.0346)	0.0824 (0.0540)	0.0857* (0.0467)	0.0580 (0.0525)	0.1648 (0.1117)	0.0449 (0.0457)	0.0066 (0.0387)
Mean control group	0.193	0.158	0.252	0.191	0.145	0.283	0.238	0.146
<i>Monthly earnings</i>	-206.3394 (454.8568)	165.3628 (434.8564)	-197.2966 (991.5577)	582.4215 (740.9820)	1,663.0461** (660.6672)	-648.1405 (1,988.6684)	94.6817 (645.8421)	-631.2885 (665.6751)
Mean control group	5041	3617	7496	5208	3673	8309	5261	4817
<i>Ln Monthly earnings</i>	0.0359 (0.0839)	-0.0171 (0.1220)	0.1394 (0.1153)	-0.0694 (0.1657)	0.0449 (0.2317)	-0.1454 (0.2375)	0.1344 (0.1142)	-0.0638 (0.1300)
Mean control group	8.681	8.488	8.906	8.738	8.504	9.032	8.738	8.619
<i>Labor force participation</i>	-0.0062 (0.0234)	-0.0099 (0.0359)	0.0128 (0.0211)	0.0558 (0.0386)	0.0724 (0.0533)	0.0263 (0.0368)	0.0087 (0.0334)	-0.0203 (0.0345)
Mean control group	0.870	0.815	0.965	0.873	0.825	0.970	0.869	0.871
Observations	3,279	2,041	1,238	1,020	677	343	1,729	1,549

Notes: Regressions use the full sample. All specifications control for training institutions (COS) and region (10 “regiones”). Standard errors in parentheses. Significance levels are indicated by \*10%, \*\*5%, and \*\*\*1%.

## 4.2 Labor market trajectories

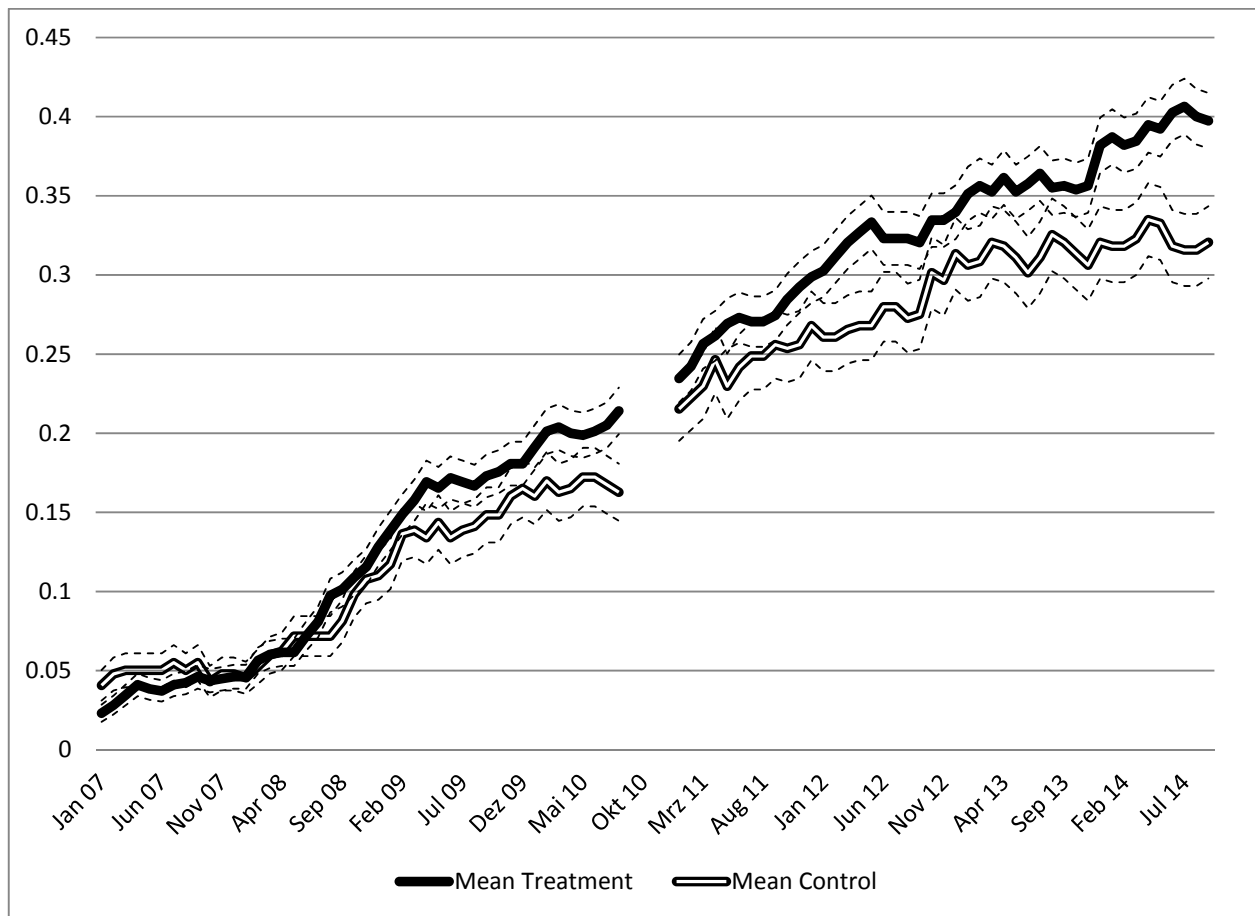
The persistent long-term impact of the Juventud y Empleo training program on formality for men is the most significant and consistent result in all the specifications. The coefficients in Tables 5 through 7 are estimated for the point in time six years after the treatment. In addition to assessing the impacts at the long-term follow-up, we can use a set of retrospective questions on labor market status in the short-term and long-term surveys to construct labor market trajectories on a monthly basis over the full time horizon (with a very small gap of four months from September to December 2010 not covered by the data due to the timing of the surveys). For this purpose, we merge the short-term and long-term data to combine individual trajectories.

We construct these labor market trajectories for the formal employment rate, as this has been identified as the most relevant outcome in the previous section. Figure 1 depicts the long-term trajectory of formal employment for men, separately for the treatment and control groups. The figure shows several patterns. First, the percentage of men that hold formal sector jobs increases over time for both treatment and controls. It starts at around 5 per cent for both groups before the start of the program, and increases over the six years to approximately 32 per cent for the control group and 40 per cent for the treatment group. Second, the trajectories indicate a slight lock-in effect: the treatment group employment rate is lower than the control group employment rate initially, but the curves soon intersect once the program is over. Third, from that point in time onward the average monthly employment rate for men in the treatment group lies always above the average for the control group. Fourth, this difference is not statistically significant for a substantial time period, but the gap widens and becomes statistically significant during the last 1 to 1.5 years. This indicates that the initially small gains are consistent and increase over time.

Figures A1 to A6 in the appendix depict corresponding labor market trajectories for several other (sub-) samples: for the full sample as ITT and ATT; for women; for youths in Santo Domingo; and separately for the younger age group ( $\leq 21$  years of age) and the older age group ( $>21$  years of age). Overall, the figures strengthen several of the patterns seen in Figure 1: First, a continuously increasing trend in employment rates over time for all (sub-) samples, in both treatment and control groups. Second, a

lock-in effect during the year 2008, such that the treatment group trajectory typically crosses the control group trajectory during the year 2009. Third, for the years three to six after treatment in all (sub-) samples the treatment group has a consistently higher employment rate than the control group – a rather pronounced pattern, despite the fact that the confidence intervals indicate that the difference is often not statistically significant. However, fourth, in several of the graphs the treatment-control difference does become significantly positive during the last 1 to 1.5 years prior to the long-term follow-up. Overall, this suggests that program gains do develop over time and do persist.

**Figure 1. Labor market trajectory: Formal employment rate – ITT men**



Notes: The figure depicts monthly averages for treatment and control groups from the time of random assignment until long-term follow-up. Dashed lines correspond to 95% confidence intervals. The labor market trajectories are constructed from merging retrospective information collected in the 2010 and 2014 surveys. Due to the timing of the two surveys, the 4-month-period from September to December 2010 is not covered by the data.

### 4.3 Local labor market context

Local labor market conditions may play a role in determining labor market outcomes and also the effectiveness of labor market interventions, as is the case e.g. for Job Corps in the US (Flores-Lagunes et al. 2010). In the main specifications (Tables 5 to 7, also Figure A4) we find that it is particularly youths in Santo Domingo, the capital, that benefit from participation in Juventud y Empleo. We investigate the role of local labor market further by looking at results by the three Dominican macro-regions, “Cibao” (North), “Sur” (South), and “Este” (East), where the latter excludes Santo Domingo. The corresponding regression results are reported in Tables A1 to A3 in the appendix.

In general, the results are not very strong, but do show some coarse pattern by macro-region. First, the North is the region for which we find significantly negative impacts on overall employment and labor force participation, driven by the results for the young women in the sample. For women themselves, also the impact on monthly earnings is significantly negative. At the same time, the North is the one region with a significantly higher rate of youths being in education: the overall average probability to report “currently being studying” is 6.2 percentage points or 11.1 per cent higher in the North (base probability 54.8 per cent, numbers not reported in the table). This pattern would be in line with the lower level of labor market outcomes, in particular for the labor force participation rate. Since marriage rates or number of children are not significantly different between regions, these are unlikely to be key explaining factors.

Looking at the South, almost all estimated coefficients are not significantly different from zero, the sole exception being a positive impact on formality for males. Different from the results for North and South, the regressions for the East do show the main impacts we saw for the overall sample on formality (Table A2), driven mainly by the male population. One might argue that these results for the East are in line with the positive findings for the Santo Domingo subpopulation, in a way that also the region surrounding the capital benefits more strongly than other parts of the country. This may have to do mostly with the fact that the capital is characterized by the most dynamic labor market of the country, such that a skills training program may be more beneficial in a context where these skills are actually in demand.

## 5 Conclusions

To the best of our knowledge, this paper is the first experimental analysis of the long-term impacts of a job training program outside the US. The evidence from these earlier experimental US studies – also focusing almost exclusively on training programs for disadvantaged youths (The National Supported Work Demonstration in the 1970s, JOBSTART in the 1980s, Job Corps in the 1990s) – indicates long-run impacts that are small positive at best, but generally tend to be close to zero. In the case of Job Corps, positive medium-run impacts on earnings do not seem to be sustained in the longer run. Against the background that some of these programs are comparatively intensive (and costly), these are certainly not encouraging results for the conception and design of youth training programs.

In the case of this new experimental long-term impact evaluation, we find a series of interesting results: because of the program, young men seem to have a better start of their careers, in the formal sector, and urban women improve their earnings. More specifically, our results show that there is a statistically significant long-run impact on the formality of employment for men (as measured by jobs with health insurance benefits) participating in the Juventud y Empleo program. This effect of the Juventud y Empleo program was previously reported in the short-run evaluations, and it is important to see that this impact is sustained over a long time horizon. Moreover, the long-term labor market trajectories we construct suggest that the effect is growing over time. Such lasting impacts in the quality of employment can make an important difference in the employment experience of young people and their lifetime labor market trajectories.

Second, the ITT and ATT estimates also provide evidence of sustained earnings impacts for female youngsters in the country's most important urban labor market, Santo Domingo. This, together with the impacts on formality for males, suggests that the returns to skills investments may be particularly relevant in the context of a more dynamic labor market where the demand for these skills is higher. The East region surrounding the capital also seems to benefit from this local labor market context (although to a lesser extent), whereas for the other two macro-regions North and South this does not seem to be the case.

Finally, for the full sample, the long-term impacts on labor earnings and overall employment probability are frequently close to zero in size and not statistically significant, which is compatible with the US studies. This result also has to be seen against the background that the total skills investment implied by the program is not very large compared to training programs in developed countries.

Overall we interpret our results as indicating that training programs for disadvantaged youth can have positive long-term outcomes: the *Juventud y Empleo* training improves formality in a context of high informality; and it seems to increase earnings in that part of the labor market in the Dominican Republic that is comparatively dynamic and where actual demand for skills exists. It is important to highlight the fact that a program of this kind has impacts on formality: given the high rate of informality of young people in LAC, impacts on the probability of being formally employed may change the path on which young people start their careers and can have lifelong impacts.

These findings are relevant for a much broader set of countries, since a multitude of economies worldwide face similar types of labor markets, and challenges for youths. Moreover, the training offered here, while not as comprehensive as the very intensive – and costly – interventions analyzed in previous research on long-term impacts (e.g. *Job Corps* in the US) does combine a sizeable investment in both classroom and on-the-job training, and is thus comparable and similar to many youth interventions that are used across countries. Moreover, additional external validity comes from the fact that this is not a pilot intervention or pilot evaluation, but a rigorous long-term study on an active labor market program that is part of the set of public policies offered in a developing country to improve labor market opportunities for youth.

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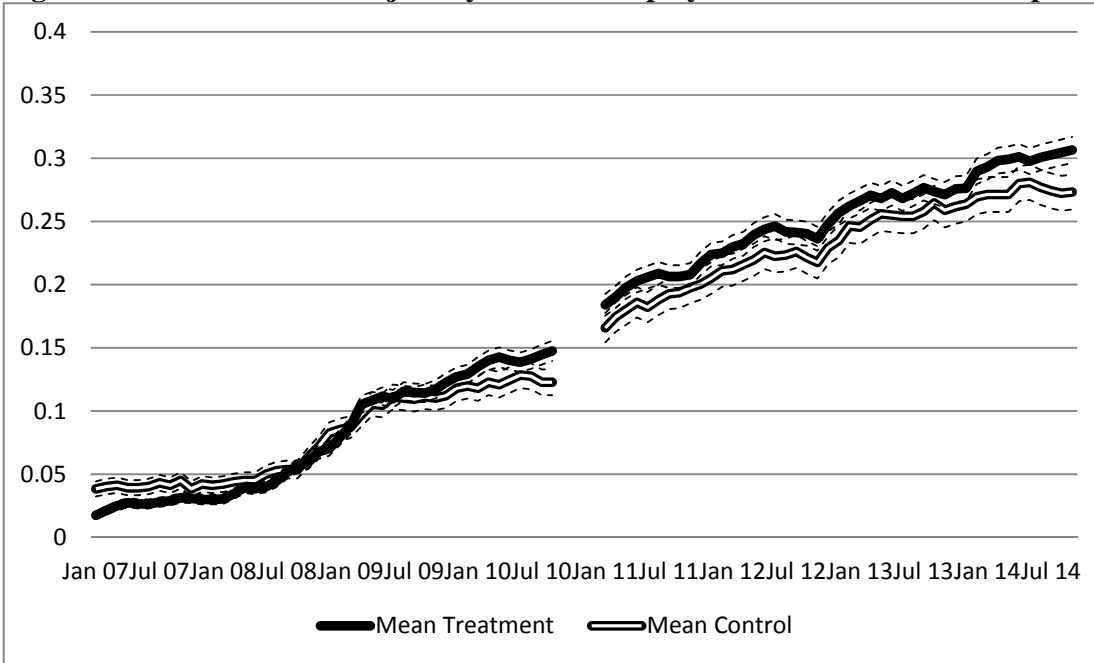
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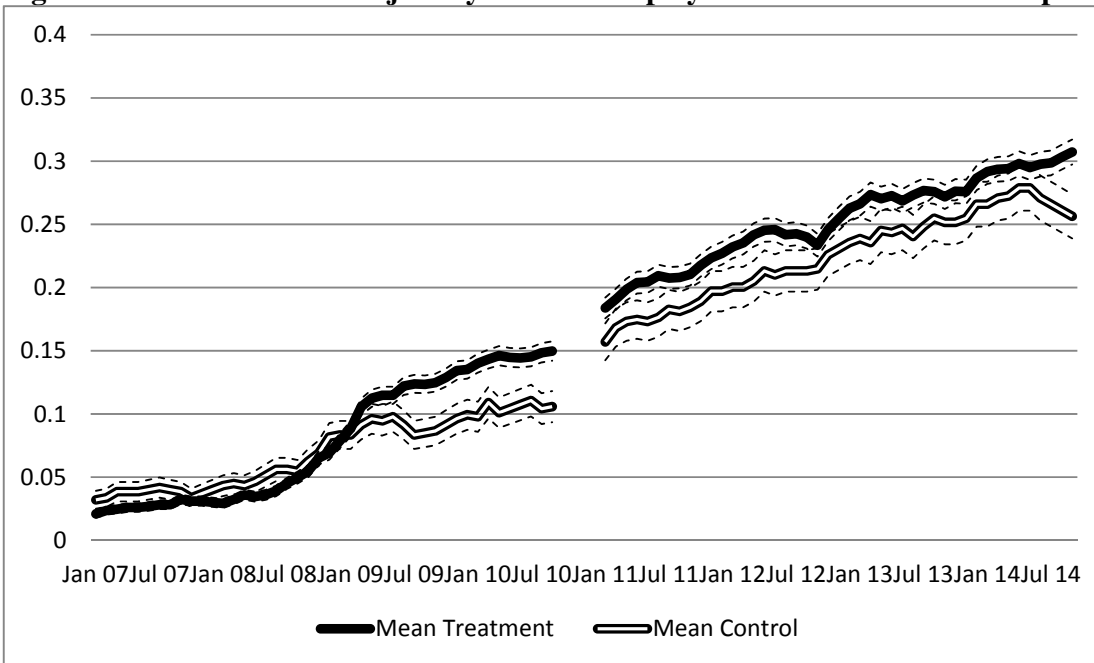
Appendix

Figure A1. Labor market trajectory: Formal employment rate – ITT full sample



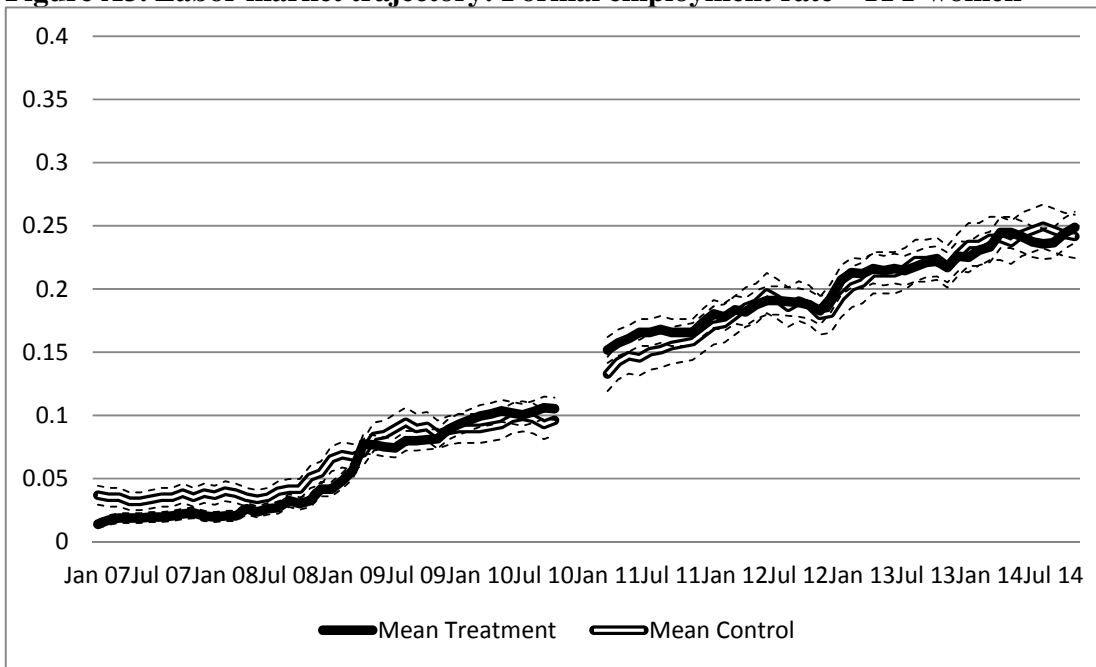
Notes: See notes to Figure 1.

Figure A2. Labor market trajectory: Formal employment rate – ATT full sample



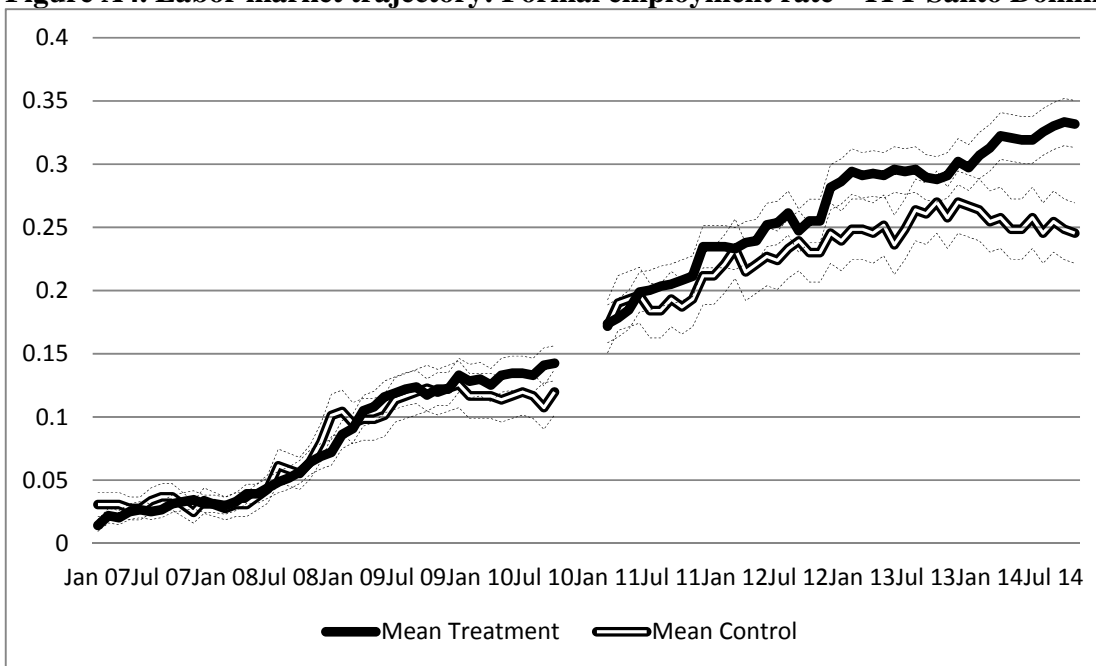
Notes: See notes to Figure 1.

**Figure A3. Labor market trajectory: Formal employment rate – ITT women**



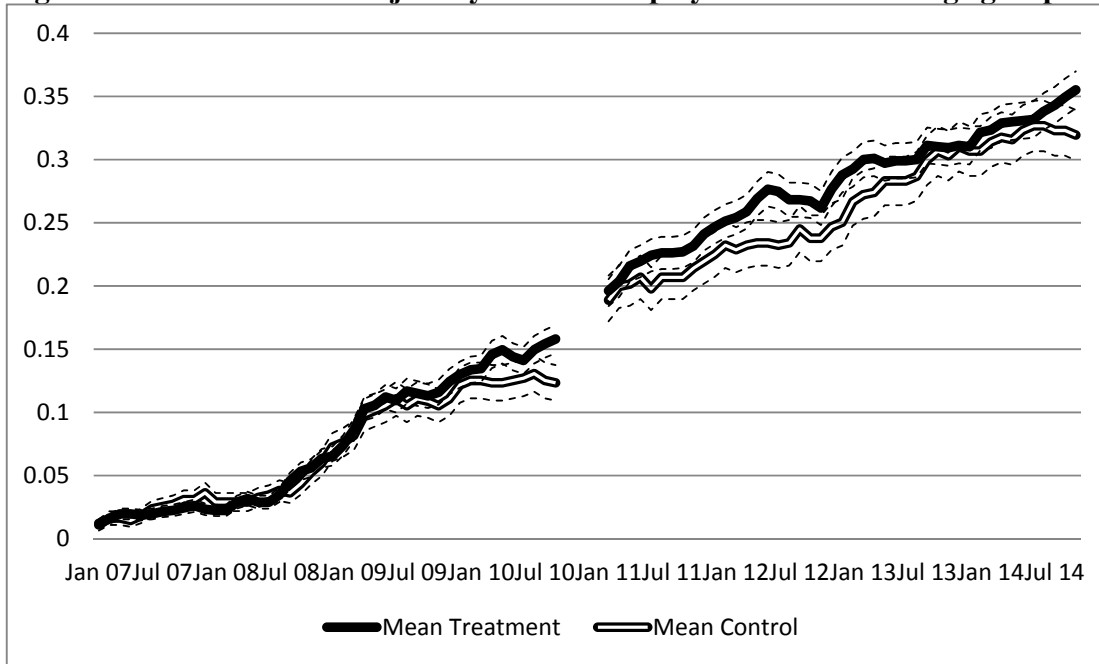
Notes: See notes to Figure 1.

**Figure A4. Labor market trajectory: Formal employment rate – ITT Santo Domingo**



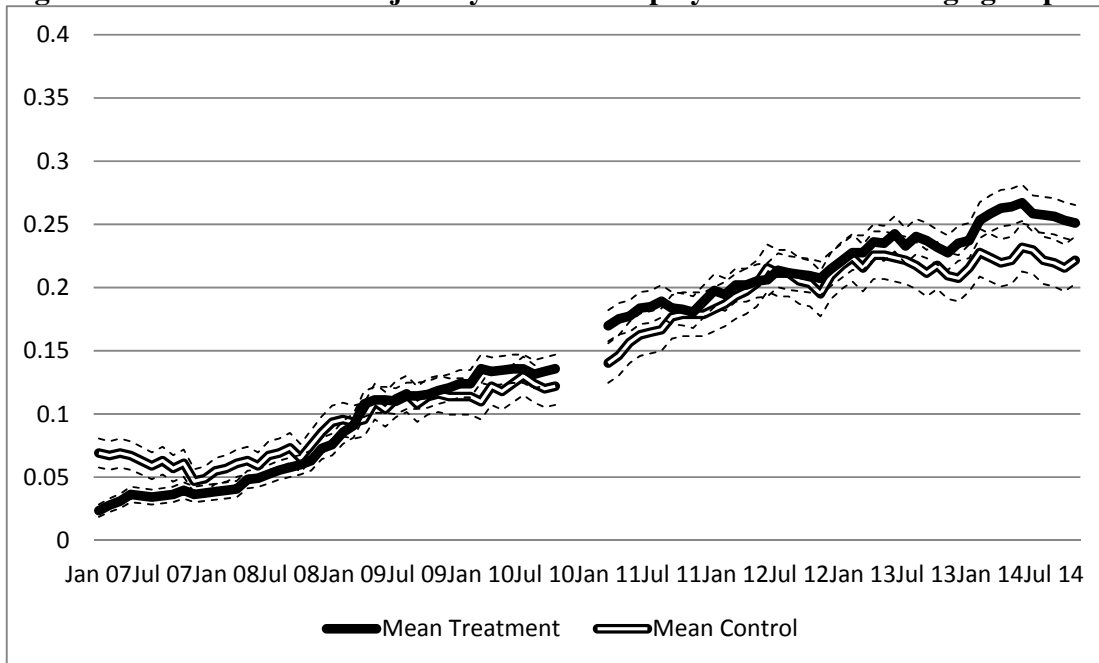
Notes: See notes to Figure 1.

**Figure A5. Labor market trajectory: Formal employment rate – ITT age group  $\leq 21$  years**



Notes: See notes to Figure 1.

**Figure A6. Labor market trajectory: Formal employment rate – ITT age group  $> 21$  years**



Notes: See notes to Figure 1.

**Table A1. Long-term impacts of “Juventud y Empleo” on labor market outcomes by macro-region: ITT**

Outcome	(1) North	(2) North women	(3) North men	(4) South	(5) South women	(6) South men	(7) East	(8) East women	(9) East men
<i>Employed</i>	-0.0843*** (0.0269)	-0.1371*** (0.0412)	0.0009 (0.0310)	0.0021 (0.0293)	0.0056 (0.0450)	0.0028 (0.0406)	-0.0007 (0.0315)	0.0188 (0.0444)	-0.0163 (0.0364)
Mean control group	0.797	0.750	0.854	0.684	0.590	0.854	0.767	0.672	0.908
<i>Employed w/ health insurance</i>	-0.0184 (0.0352)	-0.0833* (0.0467)	0.0653 (0.0546)	0.0106 (0.0285)	-0.0180 (0.0379)	0.0847** (0.0397)	0.0297 (0.0350)	0.0198 (0.0430)	0.0504 (0.0575)
Mean control group	0.279	0.275	0.285	0.197	0.168	0.250	0.316	0.273	0.379
<i>Employed w/ written contract</i>	-0.0221 (0.0291)	-0.0352 (0.0408)	-0.0025 (0.0467)	0.0258 (0.0282)	0.0202 (0.0325)	0.0476 (0.0548)	0.0172 (0.0314)	0.0103 (0.0375)	0.0424 (0.0540)
Mean control group	0.217	0.188	0.254	0.138	0.104	0.198	0.260	0.211	0.333
<i>Monthly earnings</i>	-782.6251 (481.1298)	-899.2740** (394.1821)	-469.1724 (1,035.7267)	-51.8795 (378.4305)	-252.2339 (439.4946)	697.1834 (778.2400)	135.2489 (540.4879)	343.3590 (599.0169)	-154.0295 (986.6684)
Mean control group	5909	4250	7952	4409	3270	6462	5545	3993	7829
<i>Ln Monthly earnings</i>	0.0075 (0.0702)	-0.0379 (0.1094)	0.0558 (0.0956)	0.0711 (0.0782)	-0.0837 (0.1064)	0.2359* (0.1259)	0.0264 (0.0888)	0.0292 (0.1333)	0.0474 (0.1099)
Mean control group	8.721	8.497	8.943	8.582	8.458	8.728	8.686	8.494	8.891
<i>Labor force participation</i>	-0.0666*** (0.0214)	-0.1108*** (0.0344)	0.0042 (0.0241)	0.0305 (0.0265)	0.0308 (0.0432)	0.0302 (0.0203)	-0.0057 (0.0226)	0.0070 (0.0371)	-0.0247* (0.0134)
Mean control group	0.910	0.887	0.938	0.833	0.763	0.958	0.916	0.859	1
Observations	834	481	353	769	491	278	656	392	264

Notes: Regressions use the corresponding full samples for the Dominican Republic’s three macro-regions “Cibao” (North), “Sur” (South), and “Este” (East), where the latter excludes Santo Domingo. All specifications control for training institutions (COS) and region (10 “regiones”). Standard errors in parentheses. Significance levels are indicated by \*10%, \*\*5%, and \*\*\*1%.

**Table A2. Long-term impacts of “Juventud y Empleo” on labor market outcomes by macro-region: ATT**

Outcome	(1) North	(2) North women	(3) North men	(4) South	(5) South women	(6) South men	(7) East	(8) East women	(9) East men
<i>Employed</i>	-0.0768** (0.0354)	-0.1194** (0.0507)	-0.0025 (0.0416)	0.0203 (0.0309)	0.0378 (0.0455)	-0.0226 (0.0435)	0.0478 (0.0435)	0.0644 (0.0619)	0.0092 (0.0516)
Mean control group	0.806	0.761	0.857	0.670	0.567	0.862	0.730	0.629	0.902
<i>Employed w/ health insurance</i>	-0.0222 (0.0392)	-0.0706 (0.0548)	0.0453 (0.0539)	0.0176 (0.0375)	-0.0023 (0.0456)	0.0725 (0.0573)	0.1037** (0.0435)	0.0586 (0.0554)	0.1827** (0.0704)
Mean control group	0.291	0.284	0.299	0.195	0.167	0.246	0.261	0.243	0.293
<i>Employed w/ written contract</i>	-0.0474 (0.0328)	-0.0633 (0.0490)	-0.0123 (0.0420)	0.0227 (0.0315)	0.0182 (0.0319)	0.0395 (0.0659)	0.1034** (0.0427)	0.0681 (0.0522)	0.1712*** (0.0641)
Mean control group	0.242	0.216	0.273	0.135	0.100	0.200	0.198	0.171	0.244
<i>Monthly earnings</i>	-545.6250 (544.3540)	-744.9065 (511.5383)	46.2285 (995.1156)	112.4076 (489.2831)	-135.0655 (551.8664)	475.4241 (787.7755)	1,006.2458 (696.3942)	814.0878 (714.5601)	843.0617 (1,455.9153)
Mean control group	5925	4289	7795	4315	3234	6311	5001	3688	7244
<i>Ln Monthly earnings</i>	0.0315 (0.1076)	-0.0674 (0.1775)	0.1230 (0.1278)	0.0412 (0.0954)	-0.0552 (0.1331)	0.1326 (0.1331)	0.0435 (0.1050)	-0.0405 (0.1387)	0.1474 (0.1662)
Mean control group	8.723	8.526	8.901	8.580	8.440	8.745	8.666	8.543	8.818
<i>Labor force participation</i>	-0.0409 (0.0248)	-0.0524 (0.0426)	-0.0050 (0.0285)	0.0129 (0.0292)	-0.0072 (0.0457)	0.0266 (0.0269)	0.0499 (0.0335)	0.0826 (0.0519)	-0.0214* (0.0116)
Mean control group	0.909	0.875	0.948	0.843	0.783	0.954	0.874	0.800	1
Observations	755	427	328	719	458	261	605	362	243

Notes: Regressions use the corresponding samples of groups A and C (treated) and D (controls) separately for the Dominican Republic’s three macro-regions “Cibao” (North), “Sur” (South), and “Este” (East), where the latter excludes Santo Domingo. All specifications control for training institutions (COS) and region (10 “regiones”). Standard errors in parentheses. Significance levels are indicated by \*10%, \*\*5%, and \*\*\*1%.

**Table A3. Long-term impacts of “Juventud y Empleo” on labor market outcomes by macro-region: LATE estimates**

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Outcome	North	North women	North men	South	South women	South men	East	East women	East men
<i>Employed</i>	-0.2036*** (0.0645)	-0.3720*** (0.1113)	0.0019 (0.0645)	0.0035 (0.0000)	0.0094 (0.0000)	0.0048 (0.0667)	-0.0018 (0.0767)	0.0431 (0.0987)	-0.0472 (0.1016)
Mean control group	0.787	0.739	0.853	0.681	0.575	0.878	0.722	0.620	0.887
<i>Employed w/ health insurance</i>	-0.0444 (0.0826)	-0.2259* (0.1204)	0.1398 (0.1178)	0.0183 (0.0000)	-0.0303 (0.0000)	0.1460** (0.0645)	0.0740 (0.0850)	0.0453 (0.0938)	0.1457 (0.1614)
Mean control group	0.270	0.246	0.304	0.196	0.157	0.268	0.284	0.250	0.339
<i>Employed w/ written contract</i>	-0.0534 (0.0675)	-0.0956 (0.1041)	-0.0055 (0.0970)	0.0444 (0.0000)	0.0340 (0.0000)	0.0820 (0.0880)	0.0429 (0.0768)	0.0235 (0.0826)	0.1226 (0.1536)
Mean control group	0.225	0.204	0.255	0.149	0.118	0.207	0.210	0.180	0.258
<i>Monthly earnings</i>	-1,890.6513* (1,137.6799)	-2,439.5573** (1,018.7876)	-1,003.9579 (2,157.1896)	-89.2155 (0.0000)	-424.7839 (0.0000)	1,201.4129 (1,328.6650)	337.1953 (1,318.1609)	785.6898 (1,328.5032)	-444.9637 (2,712.5867)
Mean control group	5592	4066	7717	4348	3129	6622	4906	3615	6989
<i>Ln Monthly earnings</i>	0.0181 (0.1654)	-0.1092 (0.0000)	0.1167 (0.1943)	0.1263 (0.0000)	-0.1463 (0.0000)	0.4270* (0.2428)	0.0684 (0.2229)	0.0655 (0.2839)	0.1453 (0.3200)
Mean control group	8.708	8.501	8.937	8.576	8.409	8.769	8.676	8.546	8.828
<i>Labor force participation</i>	-0.1610*** (0.0535)	-0.3007*** (0.0987)	0.0090 (0.0503)	0.0525 (0.0000)	0.0518 (0.0000)	0.0520 (0.0334)	-0.0143 (0.0548)	0.0161 (0.0818)	-0.0715** (0.0364)
Mean control group	0.889	0.852	0.941	0.847	0.784	0.963	0.870	0.790	1
Observations	834	481	353	769	491	278	656	392	264

Notes: Regressions use the corresponding full samples for the Dominican Republic’s three macro-regions “Cibao” (North), “Sur” (South), and “Este” (East), where the latter excludes Santo Domingo. All specifications control for training institutions (COS) and region (10 “regiones”). Standard errors in parentheses. Significance levels are indicated by \*10%, \*\*5%, and \*\*\*1%.