The Making of Civic Virtues: A School-Based Experiment in Three Countries

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This paper shows that schools can foster the transmission of civic virtues by helping students to develop concrete, democratically chosen, collective projects. We draw on a RCT implemented in 200 middle schools in three countries. The program leads students to conduct citizenship projects in their communities under the supervision of teachers trained in the intervention. The intervention caused a decline in absenteeism and disciplinary sanctions at school, alongside improved academic achievement. It also led students to diversify their friendship network. The program has stronger effects when implemented by teachers who are initially more involved in the life of the school.

JEL: I20; I24; J24

Keywords: citizenship; education; teaching practices; project-based

learning; RCT; youth

Even though there is no universally accepted definition, the civic sense in a society is commonly measured by the respect that citizens show to the rules of collective life, their involvement in the definition of these rules as well as the priority they give to general interest over private interests. In modern democracies, good citizenship is also commonly understood to include tolerance for the diversity of religions, sexual minorities and political opinions as well as support for the idea of equal rights for all citizens, regardless of gender, race and origin.

These civic virtues have long been identified as central to the stability of democratic societies and to their economic development.¹ The importance of cultivating them in younger generations is constantly reaffirmed, and most modern school curricula include a civic education program (Heater, 2004). However, the effectiveness of civic education in schools is still a matter of debate, and there is no real consensus on how best to teach civics in societies as diverse as modern ones (Campbell, 2019). At a deeper level, it is not even clear whether civic sense in

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¹See Putnam (1993), Tabellini (2008) or Guiso, Sapienza and Zingales (2011). For a discussion of the different liberal and republican conceptions of civic virtue, see e.g. Burtt (1993).

modern societies can be considered a form of human capital that can accumulate or depreciate based on implemented policies, including educational ones. The fundamental institutions and values of modern democracies are being rejected by increasingly large sections of the population, despite an unprecedented rise in educational levels (Dalton, 2017; Carothers and O'Donohue, 2019).

In this article, we demonstrate that fostering altruism, tolerance, political participation, and respect for collective rules among young adolescents is achievable by assisting their teachers in implementing a pedagogy based on student empowerment, and integrating it into the design and implementation of concrete civic-oriented projects. These results are in line with the long-held hypothesis that schools are among the places where children can best develop their civic sense by learning to cooperate in practice around projects that they have chosen and that concern them directly (Dewey, 1915; Williams, 2003).

These findings are based on a large-scale randomized experiment conducted in a sample of more than 200 middle schools in three different countries (France, Greece and Spain). The intervention was designed in the aftermath of the Paris terrorist attacks in 2015 and is part of joint efforts in several European countries to promote civic spirit, religious tolerance, democratic values and equal rights on the old continent.

In these schools, during the 2018-2019 school year, about 320 teachers and 6,200 grade 8 and 9 students participated in the experiment. Half of participating schools within each country were randomly selected to implement the program (called Active Citizenship Program, hereafter ACT). Teachers from treatment schools first attended a two-day training program at the beginning of the academic year and then supervised the implementation of a concrete civic-oriented project with their students. Students first had to elicit a project democratically, and then run it over the school year. The idea behind this approach is that empowering students through the concrete practice of civic engagement and the exercise of democratic rules may help them develop the skills necessary to adopt civic behavior. A majority of the projects selected are designed to show solidarity and empathy towards people and students facing difficulties (for example, performing a small play in a hospital or retirement home; organizing a day to raise awareness of the problems faced by disabled people or migrants; organizing homework help for students in difficulty, etc.).

As stated in the pre-analysis plan, program effects are identified through preand post-intervention surveys that measure students' social and political engagement, their adherence to civic values as well as the size and diversity of their friendship networks. We also have information on student participation in the Global Climate Strike for Future, which took place on March 2019, at the end of the intervention. This provides us with a concrete measure of students' propensity for political participation, a dimension often particularly difficult to identify among young people. On the French site of the experiment, we also use administrative data on unjustified absences, late arrivals and disciplinary sanctions, of which the most severe (exclusions) arise from acts of incivility or violence towards teachers and other students. These data provide us with objective measures of students' ability to respect teachers, classmates, and the rules of school life, namely some of the most basic dimensions of citizenship that a middle-school student may or may not demonstrate. We also have administrative data on grades given by teachers, which allows us to assess the impact of the treatment on students' academic engagement, a final dimension mentioned in the pre-analysis plan.

The comparison of treatment and control students before and after the intervention reveals that the intervention produced a significant improvement in student behavior. We observe a decline in unjustified absences and late arrivals as well as in disciplinary sanctions, especially the most serious ones. The summary index of student behavior increases by 27% of a SD. We also observe a significant improvement in grades assigned by teachers (13% of a SD), including in subjects where no teacher was involved in the experiment, i.e., in subjects where teaching methods and curriculum content remain unchanged. The same comparison of treated and control students also reveals that the intervention helps students to develop their network of friends and to open up to peers with different profiles. Specifically, we show that the program has a sizeable, positive impact on the number of 'socially different' friends (as measured by gender, social origin or geographic origin), while having no effect on the number of 'socially similar' friends. This greater openness may be due in part to project themes chosen by project participants, which are often about fighting prejudice and discrimination based on gender or origin. It is likely also due to the fact that the program requires students to work in small groups that are more diverse than initial friendship networks. In fact, we show that the treatment effect on network heterophily is stronger when participants are assigned to a small group with a higher share of socially different classmates.

Hence, the introduction of an active-learning method for civic education is accompanied by a significant improvement in a range of objective measures of students' compliance with school rules, their academic engagement and their ability to interact with people who do not share their cultural or social background. On a more subjective level, student surveys conducted at the beginning and end of the academic year reveal that students who benefit from the intervention feel more able to act on political and social issues. In line with this empowerment, they do show greater levels of social engagement in and out of school, as well as higher participation in the Global Climate Strike for Future. Very similar results were found at the Greek, Spanish and French sites.

In the pre-analysis plan written before the intervention, we hypothesized that the program's effects might be particularly strong on the most successful and committed students. We test this hypothesis both in the way set out in the pre-analysis plan and using Machine Learning techniques designed to explore the heterogeneity of treatment effects. These analyses confirm that the students most strongly affected by the intervention tend to be those who had the best grades and were already the most altruistic and interested in politics at baseline. Above all, our heterogeneity analysis reveals the key role played by teachers. When we measure the involvement of teachers by their baseline participation in the various school councils, we see that treatment effects on students' civic behavior or political participation are much larger when the program is implemented by the most involved teachers, in line with the recent literature on the effect of teachers on the transmission of non-cognitive skills (Jackson, 2018; Kraft, 2019; Petek and Pope, 2022). Student-centered pedagogy is hard to use efficiently because teachers must balance student autonomy with the right level of guidance, a question that has long been debated in educational science (Lazonder and Harmsen, 2016). The complexity of such teaching places high demands on teachers, with strong heterogeneity in their ability to meet these demands (Crawford, 2007). In the context of civic education, it seems that the teachers who are most civic-minded and accustomed to collective deliberation are also the ones best equipped to tackle this pedagogical challenge.

Importantly, the treatment effect heterogeneity across teachers does not appear to be mediated by the nature of the project implemented. Similarly, despite differences in the types of projects chosen, treatment effects are not significantly different across countries. The key success factor of the program does not seem to be the precise theme of the project chosen, but the fact that the theme is debated and chosen democratically by local students.

To our knowledge, our paper is one of the few to provide clean evidence on the causal effects of civic-specific education on students' behavior and civic outcomes as well as on the distribution of these effects across students. It contributes to the long-standing economic literature that explores the relationship between education and citizenship (e.g., Milligan, Moretti and Oreopoulos (2004); Dee (2004); Larreguy and Marshall (2017)). It also contributes to ongoing debates on the impact that civic education in schools can have on students' attitudes and values (Campbell, Levinson and Hess, 2012; Isac et al., 2014; Donbavand and Hoskins, 2021). Drawing on a large-scale randomized experiment conducted in the US, Green et al. (2011) find that an enhanced civics curriculum that tries to foster awareness, as well as understanding of constitutional rights and civil liberties, increases knowledge about civil liberties but does not change attitudes. Although the curriculum emphasizes classroom discussion and active student participation (similarly to this study), the pedagogy is not structured around student-designed projects as in the ACT intervention.

Our paper also adds to a body of evidence obtained from the evaluation of student-based programs in civic education, such as Democracy Prep (Gill et al., 2020) or Student Voice (Syvertsen et al., 2009). The former study is of a single charter school in New York City that describes its mission as 'to educate responsible citizen scholars for success in the college of their choice and a life of active citizenship'. The authors find positive effects on later voter participation and interpret this as evidence for the efficacy of a school culture built around a civics-orientated mission. In a related contribution Cohodes and Feigenbaum (2023)

evaluate the effect of attending charter schools in Boston on academic and voting outcomes. They find a substantial effect on the probability of voting in the first presidential election after a student turns 18, though this is only for girls. The current study is more focused on the effect of a specific civics curriculum and pedagogy, as well as considering a wider set of outcomes (including school behavior, democratic participation and heterophily of friendship networks). The idea that learning by doing is an essential method of learning, including learning the skills and behaviors that make life in society possible, goes back to Aristotle and has a very long history in both economics and philosophy (Dewey, 1897; Arrow, 1962).

On a broader level, we contribute to the literature that explores the formation of pro-social values and skills during youth. In line with one central assumption of Cunha and Heckman (2007), several recent studies focus on early childhood and confirm that programs that enrich young children's interactions with their environment and develop their ability to understand the perspectives of others are able to promote pro-social behavior (Cappelen et al., 2020; Alan et al., 2021). Our article demonstrates that it is still possible to continue to develop pro-social values and skills in older children during adolescence.

The remainder of our paper is structured as follows. In Section I, we present the ACT intervention, the context in which it was formulated, its content and its experimental design. In Section II, we describe the data as well as the measures we are using. Section III shows the main results of the intervention while Section IV develops two heterogeneity analyses: as set out in the pre-analysis plan; and a data-driven version, using Machine Learning techniques. We conclude in Section V.

I. Institutional Context and the ACT Intervention

The experiment took place in three countries where the school curriculum emphasizes respect for collective rules and civic participation, and where students have the opportunity to experience a commitment to public interest by being elected as student representatives on class or school councils.² However, in these three countries civics is still not taught as such at the university level and the teachers who teach it in middle schools or high schools are not specialists in the subject. As a result, civic education is often taught in a very teacher-centered way, following textbooks closely, with teachers not mastering the subject enough to venture into too free an interaction with students (Bozec, 2016). Furthermore, in all three countries, there are recurring debates about the legitimacy of the State to impose values in civic education, particularly when these values may conflict with traditional or religious norms of at least some sections of society.

The hypothesis motivating the ACT intervention is that these difficulties can be overcome by shifting the focus of civic education from the transmission of civic knowledge and values, conveyed through teacher-centered practices, to the

²Additional information on civic education in France, Greece and Spain are provided in Appendix A.

development of concrete civic skills and behavior through the use of studentcentered teaching methods, where the topics studied are the result of debate and democratic choice of the students themselves. The aim is to give students more ownership over the learning process and reduce distrust arising from the imposition of particular viewpoints.

A. The ACT intervention

The ACT intervention took place during the 2018-2019 school year. It is based on two basic principles: empowering middle-school students, and having them define and implement concrete collective projects, designed to show solidarity and empathy towards people in their environment.

Teacher's training sessions. — Teachers are trained at the beginning of the school year over two days. These training sessions are reserved for teachers in the treatment group. The aim of these sessions is to promote teaching techniques that give students the opportunity to debate, exercise their autonomy and make collective choices. Once the content of the program and the training material has been defined, the only marginal cost of the intervention is the remuneration paid to trainers. The two-day sessions had an average of 8 teachers per trainer. Trainers are typically former teachers with a special certificate. Assuming they are paid similarly to teachers, or slightly above, this implies a cost per trained teacher in the 50-100 euros range, depending on the country specific wage scheme, or 2-5 euros per student.

ACT PROJECTS. — The ACT projects were designed and implemented by grade 8 and 9 students in treatment classes during the 2018-2019 school year, from October to April. During the first phase of implementation, students are assigned to groups of 4 to 5 students. Each group is tasked with identifying a project for the class, that must deal with one of three themes: discrimination, social inclusion or cultural diversity. The students must also specify the group of people for whom the project is primarily intended, such as students in other classes in the same school, students in another school, community groups, etc. Students must also state the objectives of their project such as: to raise public awareness, inspire change, promote dialogue, bring people together, etc.

Once this preparatory work is complete, each group presents its project to the class. A vote is then organized to elect the project that the whole class will carry out. Following the vote, the teacher helps the students develop an action plan and allocate tasks amongst themselves. Teachers are advised to spend about 20 hours with their students on the project. These hours are taken from the time usually allocated to civic education.

Table 1 shows that the elected projects cover all three possible themes: fighting discrimination (64%), social inclusion (53%) and cultural diversity (29%).³ They target groups that are most often victims of violence and discrimination, such as women, sexual minorities or people of immigrant background. Out-of-school projects (44% of the total) include collecting food from supermarkets for homeless people; visiting a retirement home so as to perform a short play; or visiting a nearby elementary school to hold a workshop related to gender equality. In-school projects include producing posters to speak out against xenophobia, racism or discrimination to their schoolmates; setting up an online quiz to detect isolation and following this up with activities to encourage interaction among students; helping non-native speakers to overcome difficulties with the local language or organizing private tutoring for those of their schoolmates with academic difficulties.

B. Experimental design

Recruitment of volunteer middle-schools took place between February and June 2018. It was restricted in each country to public schools in a subset of educational regions.⁴ Only volunteer schools and volunteer teachers entered the experimental design. Then, between July and September 2018, public authorities collected the names of the teacher(s) and students that the volunteer schools planned to include in the program, should the school be allocated to the treatment group, and communicated them to the evaluation team. A total of 270 schools expressed their interest in participating in ACT and provided those lists. Randomization then took place between September and October 2018. We first formed school strata (from 2 to 6 schools each) on the basis of similar characteristics of the schools (e.g. location and size of schools, average student social and immigration background or metrics of student achievement in previous years). Schools were then randomly allocated to the treatment and control groups within strata. Subsequently, a small number of schools stopped responding to surveys and participating in the program (1 school in France, 15 in Greece and 4 in Spain). We drop the different strata to which these schools belonged. In the end, we kept a total of 85 strata comprising 108 treatment schools and 109 control schools. This paper focuses on this set of schools. They correspond to a total of 323 volunteer teachers and 6211 listed students, of which 3194 and 3017 are in the treatment and control schools respectively (see Appendix Table D1). Although this sample was not designed to be representative of middle school students in each country, the baseline characteristics of the students in our sample are not very different from population averages, as estimated by the PISA 2018 surveys (see online Appendix B). In the following, whenever we use this basic sample to assess the effect of being assigned to the treatment group on a particular endline outcome, we will first check that the response rate for this specific outcome is not affected

³Note that each project can correspond to several themes and/or target populations.

⁴The list of regions and further details on the recruitment protocol are given in online Appendix B.

by the treatment (no differential attrition) and that, among respondents, there is no correlation between the different baseline characteristics and the probability of being treated.

II. Data and measurement

Our analysis draws on administrative data on student behavior and academic performance as well as on online surveys designed to measure the impact of the intervention on students' civic-mindedness, students' friendship networks and teachers' practices. Data from online surveys were collected on all three sites of the experiment, at the beginning and the end of the school year. These surveys targeted all volunteer teachers and all students that appeared on the class lists sent by the schools before randomization. Administrative data are only available for the French site of the experiment, but they have the advantage of being exhaustive.⁵

A. Administrative data

For each of the students participating in the French part of the experiment, we had access to administrative data on students' unjustified absences and late arrivals as well as on the number and the nature of disciplinary sanctions students were subject to over the school year. It should be stressed that the measurement of absenteeism and disciplinary problems by the school administration is very objective as it corresponds to strong legal obligations.⁶

For each of the students in the French site of the experiment, we also observe the grades received at the end of each term in each of the 11 subjects that the students take in middle school. We observe the grades received in the first quarter (before the implementation of the program) and at the end of the last quarter (after the implementation), so it is possible to test the impact of the program on end-of-year grades holding initial grades constant. As discussed in the online Appendix C, the curriculum of several of these subjects (such as Sport or French language) requires the development of social skills similar to those promoted by the ACT program, and we can expect to observe a treatment effect on the assessments received in these subjects.

B. Teacher Survey

The teacher baseline survey includes questions on teacher demographics, professional background and civic engagement at school and outside of school. In particular, we know whether the teacher participates in the various school councils (board of directors, disciplinary council, etc.). The teacher endline survey

 $^{^5\}mathrm{We}$ did not collect information on classes with non-volunteer teachers of participating schools, so it will not be possible to test for spillover effects on their students.

⁶See online Appendix C.

provides information on whether the teacher participated in the ACT training sessions, whether he or she has implemented a citizenship project, distinguishing between those developed within the framework of the ACT program and others.

We also collected information about the teacher's teaching practices. We have information on the frequency with which teachers have students work in small groups, set up whole-class discussions or have students make oral presentations. We also have information on how often students suggest classroom activities themselves or express their opinions about lessons. Using these questions, we constructed a summary *Teaching Practices* index that captures the extent to which teachers use student-centered methods that fit the principles exposed during the ACT training sessions.⁷

C. Student Survey

The student baseline survey includes questions on students' own demographic characteristics and family background, and whether students had ever been elected as a representative on the class council or the school parliament/student council. In the remainder of the paper, we use student experience as a representative to measure the student's civic-mindedness at baseline. In addition, specific questions were asked at the end of the school year to collect information on students' participation in citizenship projects.

Student surveys also collected information on friendship networks at the beginning and end of the school year. In each school, each student on the list was presented with the names of all the other students on the class list and asked whether or not each person was a friend. Student surveys also measured the effect of the intervention on social engagement, tolerance and support for equal rights, the main attitudes the ACT program aims to improve. We constructed an index of social engagement using student responses to questions about: (i) student civic engagement in their school community (such as tutoring of younger students); (ii) civic engagement outside of school (such as volunteering in an association aimed at helping the community); and (iii) altruistic behavior (adapted from the Self-Report Altruism scale (Rushton, Chrisjohn and Fekken, 1981)). To measure tolerance, students were asked the extent to which they favor social interactions with individuals who share their views on religion. Finally, support for equal rights is based on survey questions measuring the extent to which students agree with general statements on the equality of rights between citizens. Based on our indexes of social engagement, tolerance and support for equal rights, we

⁷Throughout the paper, whenever we construct an index from a set of outcomes, we follow Anderson's procedure (Anderson, 2008). This procedure involves: (i) switching the sign of outcomes where necessary so that the positive direction always indicates a "better" outcome; (ii) normalizing each outcome and (iii) computing a weighted average of normalized outcomes to build the corresponding index, where each weight corresponds to the inverse of the covariance matrix of the outcomes.

⁸Table D2 in the online appendix confirms that there are indeed strong differences in baseline levels of civic skills between representatives and non-representatives.

constructed a summary Civic Attitudes index.⁹

To assess the impact of the intervention on students' ability to participate in democratic processes, we constructed a Political Self-Efficacy index, using students' responses to a standard set of questions about their political knowledge and their self-confidence in talking about and participating in politics, adapted from Niemi, Craig and Mattei (1991). We also constructed an Interest in Politics index using students' responses to questions such as how often they talk about political issues with their parents and friends, or the likelihood that they will take part in different forms of traditional political engagement in adulthood. Finally, to get around the difficulty of measuring the political participation of 14-years-old students, we take advantage of the Global Climate Strike, which took place on March 2019 in all three countries during the experiment: we use student participation in the strike as a concrete measure of political participation. This measure has the notable advantage of being well aligned with new forms of youth political participation (Dalton, 2008). Based on our indexes of Political Self-Efficacy and Interest in Politics as well as on a dummy indicating student participation in the Global Climate Strike, we constructed a summary Democratic Participation index. Table D3 in the online appendix provides descriptive statistics showing that female and high SES students show a higher level of civic-mindedness than male and low-SES students on most summary indices, in line with international surveys (Schulz et al., 2018).

III. Results

In this section, we provide an evaluation of the effects of being assigned to the treatment group on the implementation of the program on the one hand and on students' outcomes on the other. We base our analyses on the following regression model:

$$(1) Y_{isr} = \alpha + \beta T_s + \gamma X_{is} + \delta_r + \epsilon_{isr}$$

where Y_{isr} is the outcome of interest for student (or teacher) i in school s and strata r. T_s is the binary treatment indicator, which equals one if school s is in the treatment group and zero otherwise, and X_{is} is a vector of controls selected in each individual regression through a Lasso procedure (Belloni, Chernozhukov and Hansen, 2014). Potential controls include student pre-determined characteristics (gender, age, geographical origin, family background, experience as representative, civic outcomes at baseline, grades in the first quarter) as well as teacher sociodemographic and professional characteristics (age, gender, ex-

⁹Our indexes of social engagement, tolerance and support for equal rights are based on scales that are widely used in the political science and social psychology literature, the psychometric validity of which has been largely documented. For each scale, we further check that Cronbach's alphas are above 0.7 in all national samples.

perience, seniority, certification level, experience with citizenship teaching and training, implementation of citizenship projects over the last two years, personal engagement for the community at school and outside of school) and class size. These controls may be selected at the individual student-level or averaged at the school-level. Finally, δ_r represents a full set of dummies indicating the strata used for randomization and ϵ_{isr} the residuals. The estimated $\hat{\beta}$ is the intention to treat effect.

In the case of missing baseline data and complete endline data, we impute missing covariate values. For this, we replace missing values with their mean values and include dummies indicating missing values for each covariate. Our results are not sensitive to imputing the missing covariate values. When estimating the effect of the program on sub-indexes, we report p-values of the coefficient of the treatment variable adjusted for the False Discovery Rate, using the Benjamini and Hochberg (1995) procedure, in order to account for multiple hypotheses testing. Finally, following Abadie et al. (2023), we cluster standard errors at the school level in all regressions.

A. Implementation of the program

Before estimating the effects of the program on students' civic outcomes, it is important to identify the extent to which the program was actually implemented in the treatment group and the changes this implementation induced in teacher practices. To explore these questions, we measured the effect of being assigned to the treatment group on (1) the probability that teachers completed the ACT-specific training at the beginning of the school year, (2) the probability that teachers had their students implement an ACT project during the school year, and (3) the type of pedagogy implemented by teachers during the school year. In addition, we measured the effect of the treatment on the probability that students took part in a citizenship project during the school year (whether through ACT or not).

For each of these four outcomes, the analysis is conducted on the sample of individuals who are observed at baseline and for whom the outcome is measured at endline. Appendix Tables E1 and E2 show that these working samples represent between 70% and 80% of the initial sample, but that there is no significant difference in missing rates between the treated group and the control group. These tables further show that there are no differences in baseline characteristics between the treatment and control groups for each of the four working samples.

Table 2 reports the impact of being assigned to the treatment group for each outcome under consideration. The table first confirms that the vast majority of volunteer teachers in treated schools participated in the fall training sessions

 $^{^{10}}$ We checked that the estimated effects on most outcomes of interest remained similar (and statistically significant) when all controls were removed. However, the use of controls provides generally more precise estimates.

and supervised the implementation of an ACT citizenship project during the following academic year. In contrast, the proportions of volunteer teachers who participated in the fall training sessions or supervised an ACT citizenship project are negligible in the control group.¹¹

The comparison of teaching practices in the control and treatment schools confirm that teachers in treatment schools were indeed influenced by the ACT training. Using our Teaching Practices index, Table 2 shows that, on average, teachers from treated schools declare practices that better fit the principles exposed during the training sessions, by about 43% of a standard deviation (SD).

At the end of the school year, students were also asked whether they had taken part in a citizenship project in their school. Reassuringly, the average proportion of students who report having participated in a citizenship project is much higher in treated schools than in control schools (by about 42 percentage points). In treated schools, about three quarters of students report having participated in a citizenship project, compared to less than one third in control schools. The fact that the proportion of students who participated in a citizenship project does not reach one hundred percent in treated schools reflects the fact that some projects were aborted very early in the year and that some students eventually refused to participate or did not get involved. All such occurrences were observed in qualitative work. Conversely, the fact that the proportion of students who participated in a citizenship project was not negligible in the control group confirms that project-based pedagogy is not unknown to teachers, and suggests that a significant fraction of teachers in the treated group would have conducted a citizenship project anyway, even if they had not been assigned to that group.

B. Treatment effect on student behavior and academic achievement

In the previous section, we showed that treated classes are, as expected, classes where civic education based on group projects and student initiative is used much more extensively than in the other classes. In this section, we assess whether these changes in teaching methods have been accompanied by changes in student behavior and achievement. Specifically, we report the effect of the treatment on the number of unjustified absences, late arrivals, disciplinary sanctions as well as on grades assessed by teachers, as reported in students' official academic records at the end of each academic term. We distinguish between two levels of sanctions according to their severity. The most severe sanctions (exclusions) are pronounced against acts of incivility and violence towards teachers and schoolmates. In France, as in many other countries, the problems posed by these acts are a central issue for the national education system, in part because they contribute to the deterioration of the working conditions of teachers and to their disaffection.

¹¹To implement the ACT citizenship projects, teachers in treated schools also appear to have followed the protocol provided during the training sessions. In particular, they declare having spent about 20 hours on the projects with the students, which is in line with training guidelines (see Table D4 in the appendix).

For each outcome, the analysis is conducted on the working sample of individuals who are observed in the baseline and for whom the outcome is measured at the endline. Appendix Tables E3 and E4 show that this working sample represents about 98% of the initial sample and that there is no significant difference in missing rates between the treated and control group. These tables also confirm that there is no difference in baseline characteristics between treatment and control groups for each outcome. Appendix Table F1 further confirms that there is no effect of treatment assignment on grades received in the first quarter of the school year, before program implementation.

Table 3 reports the impact of being assigned to the treatment group for each outcome (noting that all outcomes are scaled such that a positive sign denotes a better outcome). The regression results reveal a significant and positive impact on both behaviors and academic performance. In particular, the intervention resulted in a significant decrease in unjustified absences and a significant reduction in acts of violence and incivility that warrant the most serious sanction, namely exclusion from the school. We also detect a decrease in late arrivals, even though the effect is only marginally significant at standard levels. In the end, the intervention leads to an improvement of the *School Behavior* index of about 27% of a SD.¹² This result is consistent with the idea that promoting active-learning methods in civics can lead students to be more respectful of other members of the school community and the basic rules of school life. The comparison of the distribution of the *School Behavior* index for the treated and control groups further reveals that the intervention leads to an increase in the most civic-minded behaviors to the detriment of those just below or close to average (Figure 1 (a)).

The improvement in student behavior in the treated group was accompanied by an improvement in academic performance. The regression results in Table 3 shows an improvement of 13% of a SD in the average grades received post-treatment, during the last term of the school year. The comparison of the distribution of average grades for the treated and control groups further shows that the intervention leads to an increase in good and very good performances to the detriment of performances close to average (see Figure 1(b)).

To take one step further, Table 3 compares the estimated effects when we analyze volunteer and non-volunteer teachers separately. Unsurprisingly, the estimated impact is significantly higher when focusing on volunteer teachers, the majority of whom teach civics. But the estimated impact on teacher-assessed grades remains very significant (about 10% of a SD) when restricted to other teachers, those who did not volunteer for the program. This result is in line with the idea that improvements in grades are not a mere consequence of volunteer teachers wanting to promote the program, nor can they be interpreted as the

¹²As this summary index is standardized, the estimated effect does not necessarily correspond to an average of the estimated effects on the primary outcomes. For reference, the estimated effect on this summary index is of the same order of magnitude as the average effect reported by Valdebenito et al. (2018) from their meta-analysis of 37 randomized interventions aimed at reducing school exclusions and suspensions.

consequence of the implementation of more student-friendly teaching methods, since there is no reason for teaching methods to have changed in the classes of the non-voluntary teachers.¹³

A potential problem with interventions requiring students to make an extra effort in one subject is that this may result in a reduction in their efforts in other subjects and adversely affect their performance in these subjects (Ly, Maurin and Riegert, 2020). In the particular case of our intervention, the opposite is true: performance is positively affected in History-Geography (the subject that includes civic education), but also in the other subjects, so that the estimated impact of the treatment on average grades remains almost unchanged (about 10%) even when we drop the observations of both volunteer teachers and all History-Geography teachers (Table 3). This result is in line with the assumption that the program promotes attitudes and behaviors that can pay off in many different contexts. Appendix Table F2 further shows the details of the treatment effects, subject by subject. It confirms that the improvement in grades is noticeable in History-Geography (20%), but also in French Language (17%), Arts (14%) or Sports (12%), subjects in which teachers are asked to value students' ability to interact constructively with others.

C. Treatment effect on social interactions

To further investigate the changes associated with the program, it is also possible to use the information collected on friendship networks from all sites of the experiment. For each student on the list of potential participants, these data allow us to calculate the number of friends they have among the other potential participants at their school. Among the friends of each participant, it is also possible to distinguish those who share the same social and geographical origins and the same gender as him/her (socially similar friends) and those who do not share all these characteristics (socially different friends, i.e., with at least one difference). Among the latter, we can even distinguish those with one difference, two differences or three differences. Again, the analysis is conducted on the sample observed at baseline and for whom outcomes are measured at end-line. Appendix Table E2 shows that there are no significant differences in missing rates or in baseline characteristics between treated and control groups.

In this framework, the comparison of friendship networks at the end and the beginning of the year shows that the implementation of the program has no significant effect on the number of socially similar friends, but has a positive impact on the number of socially different friends (Table 4). The number of friends with at least one difference increases on average by about 0.22 (i.e., an

¹³It should also be noted that non-volunteer teachers were not specifically surveyed (the information obtained on their grades is from the usual administrative records) and that it is unlikely that they were influenced by our experimental observation scheme.

 $^{^{14}}$ For each student i, we count as "friends" those students whom i has placed on his or her friend list and who, in turn, have placed i on their own friend list.

11% increase), and those with at least two differences by about 0.10 (i.e., a 15% increase).

When we further examine each separate component of friends' identity separately, we find that the intervention simultaneously increases the number of those who have a different gender, but also the number of those with a different social origin or with a different geographical origin. Leveraging the fact that the effects on the three components of heterophily are consistently positive, the corresponding synthetic index of network heterophily is significantly higher in treated than in control classes (+11% of a SD). Similar effects are observed at all three sites of the experiment (see Appendix Table F3). As there is no decline in homophilic friendships, the total number of friendship ties tends to increase in treated classes, although the effect is only marginally significant at standard levels. Taken together, our findings are in line with the idea that project-based pedagogy is associated with intensified and more heterophilic interactions within classrooms.

This greater openness of friendship networks may be due to the fact that fighting prejudices and discrimination based on gender or origin is one of the themes most often chosen by program participants. It may also be due to the fact that, at the start of the year, participants have to work in small groups formed by their teachers, and this can help create new friendships. In France and Spain, we know the composition of these small groups, and we have been able to verify that they do indeed tend to be more diverse than the initial friendship networks observed at baseline, especially in terms of student gender. In these small groups, program participants interact on average with 44% of students of a gender different from their own, whereas their initial group of friends includes on average only around 21% of students of a different gender (see Appendix Table D5).

When we regress our endline measures of network heterophily on the interaction between the treatment dummy and variables characterizing small group composition, we find that the effect of the treatment on network heterophily tends to be stronger when participants are assigned to a small group with a higher share of socially different classmates, namely when they are forced into more heterophilic interactions within their small groups. In particular, the more participants interact with classmates who are socially different from them in their small groups, the more friends they have who are socially different from them at the end of the year and the fewer friends they have who are socially similar to them (Table 5). These results suggest that the effect of treatment on the heterophily of friendship networks derives at least in part from small-group work and from the efforts made by teachers to impose some gender and social diversity within small groups. ¹⁶

 $^{^{15}}$ The distribution of the synthetic index, separately by treatment status, is shown in Figure G1 in the online appendix.

¹⁶The recommendation made to teachers was to assign participating students to the small groups randomly. As it happens, there is no correlation between the gender (or social origin) of the participants and that of the other members of their small groups, in line with the random assignment assumption. However, baseline friends tend to be over-represented in small groups, and there is a correlation between

D. Treatment effect on civic attitudes and democratic participation

By promoting group work and a less vertical pedagogy, the program clearly contributes to improving students' relationship with the school, teachers and classmates. As these traits are predictive of broader civic attitudes (Kupchik and Catlaw, 2015; Bacher-Hicks, Billings and Deming, 2024), we may also expect the program to have an impact on broader aspects of social and political engagement. In this section, we explore these issues as directly as possible using data from online surveys conducted before and after the intervention in all three sites of the experiment. More specifically, we provide evidence on the effect of being assigned to the treatment group on the two synthetic indicators of Civic Attitudes and Democratic Participation and their underlying dimensions. As discussed above, the Civic Attitudes index is based on students' social engagement, tolerance and support for equal rights (i.e., three secondary outcomes) while the *Democratic* Participation index is based on their political self-efficacy, interest in political life and participation in the Global Climate Strike (i.e., again three secondary outcomes). Compared to administrative data, these data have the disadvantage of being more prone to desirability bias, but they have the advantage of being measured in all three sites of the experiment.

For each of the two primary outcomes and the six secondary outcomes, the analysis is again conducted on the working sample of individuals who are observed at baseline and for whom the outcome is measured at endline. Table E6 in the appendix shows that these working samples represent between 67% and 70% of the initial sample, but, again, there is no significant difference in missing rates between the treated and the control group. These tables further show that there are no differences in baseline characteristics between the treatment and control groups for each of the thirteen working samples.

Table 6 reports the impact of being assigned to the treatment group for each of the eight outcomes. The results show a positive and statistically significant point estimate for both the *Civic Attitudes* and *Democratic participation* indexes. The intervention caused an increase in the *Civic Attitude* index of about 10.2% of a SD and an increase in the *Democratic Participation* index of about 8.4% of a SD.¹⁷ Again, similar positive effects were observed at all three sites of the experiment (see online appendix Table F3).

The positive impact on the *Civic Attitudes* index is mostly driven by how the intervention affected their social engagement (and to a lesser extent, support for equal rights), something that is consistent with the fact that many of the projects chosen by students were related to helping others (elderly, minorities, other students). The positive impact on the *Democratic Participation* index is

participants' geographical origins and those of the other members of their small groups (see Appendix Table E5). The small groups are more diverse than initial friendship networks, but not as much as if assignment to small groups had been truly random.

¹⁷The distributions of these synthetic indices, separately by treatment status, are shown in Figures G2 and G3 in the online appendix.

mostly driven by change in political self-efficacy and, to a lesser extent, to an increased participation in the Global Climate Strike: this may be connected with student empowerment during the whole project, and specifically the initial vote on potential projects, which can improve their ability and willingness to participle in democratic processes and debates.

The Civic Attitudes results could be an artifact of how projects were actually implemented in the ACT program. This index includes, among others, measures of engagement at school over the last school year, such as tutoring of younger students and participation in the school newspaper; and engagement outside of school over the last school year, such as volunteering in a humanitarian association or in an association aimed at helping the community or mentoring younger children (with homework, in sports, etc.). Given that some of the projects implemented during the ACT program can consist of tutoring other students or helping the community, the positive effect we find could be a direct measure of the implementation of the program, rather than of its effects. To test this hypothesis, we have been through the description of class projects provided in our teacher survey, and excluded all observations for which the project corresponds to one of the questions used for our social engagement measure. We also excluded the projects that could not be classified (non-response or ambiguous description). To the extent that such observations might overstate the impact measure, we can form a conservative estimate of the effect by running our regressions with these observations excluded. The main results are reported at the bottom of Table 6 (and detailed results in Table F4 in the online appendix). They show that the findings are robust: the effect on the Civic Attitudes index is now +7.1% of a SD, compared to +10.2% in the full sample, and the coefficient on the *Democratic* Participation index is now +7.9% of a SD instead of +8.4%. There is no evidence that our results are an artifact of how the program was implemented.

IV. Heterogeneity analysis

The implementation of the ACT program coincides with an improvement in student behavior and academic performance. An important question, however, is whether this improvement has affected all students. In this section, we draw on the pre-analysis plan written before the start of the experiment and on Machine Learning techniques to shed light on this issue.

A. Pre-registered heterogeneity analysis

In the pre-analysis plan, we hypothesized that treatment effects might differ by gender and family background. Female students and high-SES students tend to have better behavior and better grades, (as confirmed by Table D3 in the online appendix) and we speculated that they might be more receptive to a school-based intervention such as ACT. It turns out that there is no significant variation in the impact of the treatment on school behavior, democratic participation or social

interactions between female and male students or between students with different family backgrounds (see Tables F5 and F6 in the appendix). We do, however, detect some heterogeneous effects on teachers' grades: the impact of the treatment on average grades is large and statistically significant for female students and for high SES students only, that is, for the strongest groups of students at baseline. To the extent that teacher evaluations are a measure of student engagement in school, this result is consistent with the idea that the intervention stimulates students' engagement all the more if they are committed to begin with. We also hypothesized that treatment effects might be stronger for students who had previous experience as student representatives, in line with a model in which civic skills acquired in the early school years (as a representative) and educational investments made later in school (this intervention) represent two types of inputs that are complements in the skill production function. Appendix Table F7 confirms that the impact of the treatment on school behavior, academic achievement, civic attitudes or democratic participation tends to be stronger for representatives than for the other students, although none of the impact differentials are statistically significant at standard levels.

B. Data-driven heterogeneity analysis

In the previous section, the comparison of treatment effects across pre-defined subgroups suggests that the program is most effective for the most civic-minded students at baseline. To take one step further, several Machine Learning techniques are now available to explore the heterogeneity of treatment effects in a data-driven manner, without pre-defined subgroup restrictions. We use one of these techniques, namely the generalized random forest (GRF) procedure introduced by Athey, Tibshirani and Wager (2019). This makes it possible to predict treatment effects for each student individually using all available information on his/her baseline characteristics (i.e., not simply information on the characteristics mentioned in the pre-analysis plan) and to test the existence of heterogeneity in these treatment effects. 18 Denoting Y the outcome under consideration, T the binary treatment and Z the set of baseline covariates, this procedure grows a causal forest to construct an estimate of the conditional average treatment effect $s_0(Z) = E(Y_1 - Y_0|Z)$, where Y_1 and Y_0 represent students' potential outcomes in treated and non-treated states. Following Athey and Wager (2019) and Chernozhukov et al. (2018), it is then possible to test for the existence of heterogeneity in $s_0(Z)$.

We conducted this test by considering our main outcome variables, namely, the dummy variable indicating participation in a citizenship project, the index of *School Behavior* and academic achievement constructed from administrative

¹⁸To train our procedures, we use our baseline measures of students' civic skills (all scales and subscales), baseline measures of teachers' characteristics, friendship ties, the country of the school as well as dummies indicating experience as a student representative, gender, geographic origin and family socioeconomic background.

data, the index of *Civic Attitudes* and *Democratic Participation* constructed from online surveys and the variable capturing the degree to which friendship networks are heterophilic. The detailed results of the different tests are given in Table 7. They show that the null hypothesis of no heterogeneity in treatment effects is unambiguously rejected for five of the six outcome variables studied.

To further explore the sources of treatment effect heterogeneity, it is possible to identify the baseline variables that are most often used by the causal forest procedure to predict individual treatment effects. This analysis shows that the most important source of treatment heterogeneity comes from the variable indicating the extent to which the teacher in charge of the program is involved in the life of the school, as measured at baseline by the number of school councils in which s/he participates.¹⁹ This involvement variable appears to be one of the main sources of treatment effect heterogeneity for the indexes of School Behavior, Democratic Participation, Civic Attitudes or network heterophily. This finding is consistent with the long-standing literature that demonstrates teacher effect heterogeneity, including on student behavioral outcomes (see e.g. Jackson, Rockoff and Staiger (2014), Jackson (2018)).

To illustrate the importance of teacher involvement, Table 8 compares the effects of the treatment according to whether the teacher in charge of the intervention belongs to the most or least involved half of the teachers. The table confirms that the effect of the program on student behavior is strong and significant for students taught by the most involved teachers, while it is much weaker and not statistically significant for those taught by the least involved teachers. When implemented by the most involved teachers, the intervention coincides with a marked reduction in absenteeism and disciplinary sanctions as well as with a significant diversification of friendship networks and a marked increase in students' participation in the Global Climate Strike. However, none of these effects are observed when the intervention is implemented by the least involved teachers.

The effectiveness of the teachers who are most involved in the life of their school is not simply a matter of their ability to get students to participate in citizenship projects, or even their ability to adapt their teaching practices. Indeed, the effect of the treatment on students' participation in citizenship projects is as strong for the least involved teachers as for the most involved ones and the effect of the treatment on teaching practices is even stronger for the least involved teachers than for the most involved ones.²⁰

To take one step further, we also compared the projects chosen by the students of least involved and most involved teachers (Appendix Table D7). Chi-square

¹⁹This variable takes on values between 0 and 4. About 24% of the teachers do not participate in any school councils, 28% participate in 1 council, 21% participate in 2 councils, 17% in 3 councils and 9% in 4 councils. As shown in Appendix Table D6, the most involved teachers tend to be more experienced than those least involved. They are also (at baseline) closer to the pedagogical principles promoted by the program.

²⁰At baseline, the teaching practices implemented by the least involved teachers are less student-centered, but the intervention leads to a catch up.

tests do not reveal any significant differences in their distribution across topics (p-value = 0.50) or across target populations (p-value = 0.81). In the end, to have an effect on student outcomes, it does not appear to be sufficient to adopt a student-centered pedagogy or to help students democratically choose a specific type of citizenship project. For this type of intervention to be effective, it must also be implemented by teachers who are themselves civic-minded and accustomed to taking part in collective deliberations.

In addition to teacher involvement, baseline measures of civic outcomes (such as baseline social engagement) appear to be important sources of heterogeneity in treatment effects on civic attitudes and participation (see Table F8 in the appendix). The fact that the program had a significantly stronger impact on the civic outcomes of the students who were initially more socially engaged or more interested in politics is consistent with the findings obtained from the preanalysis plan, which highlighted the impact of the program on students who have had experience as student representatives. This set of results is in line with the idea that the ability to accumulate civic skills in adolescence depends on the civic skills one may have accumulated earlier, during childhood.

Finally, we can emphasize that the country in which the experiment takes place never appears to be a major source of heterogeneity in treatment effects. Appendix Table F3 confirms that there is no significant variation in treatment effects across the three sites of the experiment. This result is all the more striking given that the themes of the projects chosen by the students are significantly different from one site to another (Table 1).²¹ Our findings are once again consistent with the assumption that there is no direct link between the type of project chosen and the success of the intervention - any theme can be suitable, provided it has been chosen democratically by local students.

V. Conclusion

Through a large-scale randomized controlled trial, this paper reveals the highly significant effects that implementing an active-learning method for civics education can have on students' attitudes and behaviors. The program involves training teachers to facilitate effective group work in their classrooms, so that small groups of students are able to independently discuss, elect and implement projects dealing with discrimination, social inclusion or cultural diversity. We first show that this training changed teaching practices across all three countries. We then show that, in all three settings, the program was followed by improvements in the quality of classroom social interactions and civic behavior. The program helps students make new friends (and friends less like themselves), enhance their social and political engagement, and leads them to better respect the internal rules of the school community (with fewer absences and serious sanctions). These results

 $^{^{21}}$ When we compare the distribution of projects across topics for the three countries, chi-square tests reject the equality of the distribution.

are in line with a long tradition dating back to Aristotle, Tocqueville or Dewey, which defends the idea that citizenship is learned primarily through practical investment in local, social and political life.

The comparison of treatment and control groups also reveals that the program has stronger effects when it is implemented by teachers who are initially more involved in the life of the school. This finding complements the emerging literature on teacher effects on student attitudes, and suggests that active-learning methods require strong interpersonal skills and engagement, which are heterogeneously distributed among teachers. We also find that the effects of the intervention tend to be more important on students who are initially endowed with civic skills. This finding is in line with the idea that skills acquired in the early school years and school investments made later in adolescence are complementary inputs in the education production function. More research is needed to assess the effect of implementing new civics programs based on debates, group projects, and learning by doing much more systematically in the early grades.

Acknowledgments

This paper builds on the ACT project, an Erasmus+ program funded by the European Commission (project 582958-EPP-1-2016-2-FR-EPPKA3-PI-POLICY). We would like to thank Emily Helmeid, Christelle Jouhanneau (French Ministry of Education) and Stephen Hull (British Council) for their key role in the design and implementation of this program. We are very grateful to Pacome Giraud, Dorra Hamza, Laura López-Torres, Clara Ouchar, Gabriela Sicilia, Rosa Simancas and Yannis Tsirbas for their outstanding contribution to the research field work and management; and to the Ministry teams and middle-schools and teachers for their participation in the project. We also thank participants at the RES and EALE 2022 annual conferences, the IZA/SOLE 2022 Transatlantic meeting, the 13th International Workshop on Applied Economics of Education, the 2022 Simposio de Análisis Económico, the Third Catalan Economic Society Conference as well as participants at the Paris School of Economics, J-PAL Europe and Institute for Fiscal Studies seminars for their helpful comment, and Leila Delannoy, Géraldine Martin and Alice Simon for useful discussions. We acknowledge the support of the Norface Dynamics of Inequality Across the Life-course (DIAL) Joint Research Program (research Project file number 462-16-090, entitled Human capital and inequality during adolescence and working life) and the Agence Nationale pour la Recherche (project ANR-17-0004-01) and the Economic and Social Research Council (ESRC). The project received Paris School of Economics IRB approval #2017 020. This RCT was registered as AEARCTR-0004610 (https://doi.org/10.1257/rct.4610-1.0).

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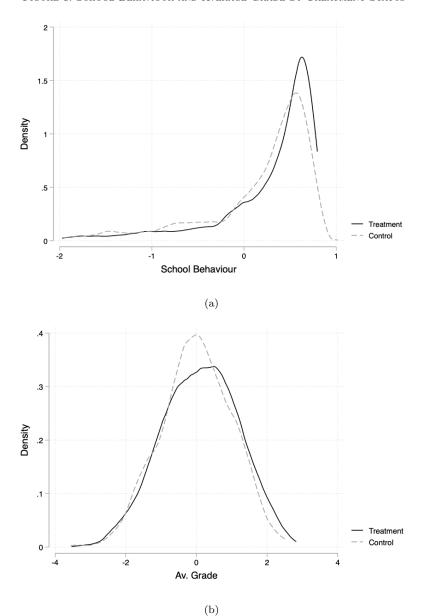
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Main Figures

FIGURE 1. SCHOOL BEHAVIOUR AND AVERAGE GRADE BY TREATMENT STATUS



Note: Figures 1 (a) and 1 (b) respectively show the kernel distribution of the standardized student school behaviour index and end-of-the-school-year grades, by treatment status.

Main Tables

TABLE 1—CITIZENSHIP PROJECTS

	(1) All	(2) France	(3) Greece	(4) Spain
Project topics				
Discrimination	$0.64 \\ (0.48)$	$0.56 \\ (0.50)$	$0.71 \\ (0.46)$	0.69 (0.47)
Social inclusion	$0.53 \\ (0.50)$	$0.50 \\ (0.51)$	0.71 (0.46)	0.47 (0.50)
Cultural diversity	0.29 (0.46)	0.18 (0.39)	$0.29 \\ (0.46)$	0.41 (0.50)
Targeted population				
Elderly	$0.15 \\ (0.35)$	$0.12 \\ (0.33)$	$0.12 \\ (0.34)$	0.18 (0.39)
Homeless	$0.12 \\ (0.33)$	0.14 (0.35)	0.17 (0.38)	0.08 (0.28)
Migrants	$0.26 \\ (0.44)$	0.14 (0.35)	$0.42 \\ (0.50)$	0.31 (0.47)
Women	$0.19 \\ (0.39)$	$0.14 \\ (0.35)$	$0.08 \\ (0.28)$	0.29 (0.46)
LGBT	0.11 (0.32)	0.10 (0.30)	0.04 (0.20)	0.16 (0.37)
Disabled	$0.26 \\ (0.44)$	0.34 (0.48)	0.29 (0.46)	0.16 (0.37)
Other	$0.25 \\ (0.44)$	0.30 (0.46)	0.17 (0.38)	0.24 (0.43)
No specific group	0.20 (0.40)	0.28 (0.45)	0.12 (0.34)	$0.16 \\ (0.37)$
General orientation of the project				
School oriented project	$0.56 \\ (0.50)$	$0.46 \\ (0.50)$	0.52 (0.51)	0.67 (0.48)
Out-of-school oriented project	$0.44 \\ (0.50)$	0.54 (0.50)	0.33 (0.48)	0.38 (0.49)
Observations	125	51	25	49

Note: This table shows the percentage of citizenship projects implemented in the treatment group that relate to each of the three topics covered by the ACT intervention, the population targeted by these projects and the share of in-school and out-of-school oriented projects. One project may correspond to multiple topics and/or targeted population. Standard deviations are in parentheses.

Table 2—Treatment Effects on Program Implementation

	(1) C	(2) T-C	(3) S.E.	(4) p-val	(5) N
Teacher-level outcomes					
Participation in ACT training	0.024	0.949	0.026	0.000	247
Actual implementation of ACT project	0.040	0.902	0.029	0.000	245
Teacher Pedagogy	0.000	0.428	0.125	0.001	254
Student-level outcomes					
Student participation in a citizenship project	0.301	0.421	0.024	0.000	4133

Note: For each of the four row variables, the first column (column C) displays the mean of the row variable in the control group; the second column (column T-C) displays the coefficient from the regression of the row variable on a treatment dummy controlling for strata fixed effects as well as for a set of controls selected from the full set of baseline variables through a Lasso procedure (Belloni, Chernozhukov and Hansen (2014)). The third column shows the standard errors clustered at the school level whereas the fourth column shows the corresponding p-value. The last column displays the size of the analysis sample, namely the sample of individuals who are observed at baseline and for whom the row variable is measured at endline. Each line corresponds to a separate regression. Attrition analysis and balance checks for the 3 first analysis samples are provided in Appendix Table E1. For the last analysis sample, they are provided in the first column of appendix Table E2.

Table 3—Treatment Effects on School Behavior and Academic Achievement

	(1) C	(2) T-C	(3) S.E.	(4) Unadj. p-val	(5) Adj. p-val	(6) N
School Behaviour	0.000	0.266	0.089	0.003	-	2251
Absence	0.000	0.249	0.104	0.017	0.034	2227
Punctuality	0.000	0.185	0.099	0.063	0.084	2227
Exclusion	0.000	0.190	0.062	0.002	0.009	2186
Smaller disciplinary sanctions	0.000	0.042	0.092	0.648	0.648	2241
Average Grade	0.000	0.126	0.040	0.002	-	2251
Av. Grade in subjects taught by volunteer teachers	0.000	0.267	0.063	0.000	-	2155
Av. Grade in subjects not taught by volunteer teachers	0.000	0.101	0.041	0.014	-	2251
Av. Grade in subjects not taught by volunteer teachers or HG teachers	0.000	0.098	0.042	0.019	-	2251

Note: Columns C, T-C, S.E. and N have the same meaning as in Table 2. Column "Adj. p-val" shows shows the p-value adjusted for false discovery rate (Benjamini and Hochberg, 1995) while column "Unadj. p-Val" shows the unadjusted p-value. Each line corresponds to a separate regression. Attrition analysis and balance checks for each of the eight analysis samples are provided in appendix Tables E3 and E4.

Table 4—Treatment Effects on Social Interactions

	(1) C	(2) T-C	(3) S.E.	(4) Unadj. p-val	(5) Adj. p-val	(6) N
Number of friends	3.650	0.195	0.130	0.133	-	4299
Nb of friends with 0 difference	1.553	-0.012	0.064	0.853	-	4298
Nb of friends with 1 difference or more	2.097	0.226	0.090	0.012	-	4299
Nb of friends with 2 differences or more	0.630	0.098	0.051	0.057	-	4299
Nb of friends with 3 differences	0.072	0.008	0.013	0.536	-	4299
Friendship Heterophily	0.000	0.107	0.043	0.012	-	4299
Nb of friends of different gender	0.892	0.123	0.056	0.029	0.058	4299
Nb of friends of different geo. origin	0.543	0.071	0.042	0.088	0.088	4299
Nb of friends of different social origin	1.364	0.133	0.064	0.039	0.058	4299

Note: Columns C, T-C, S.E., Adj. p-val, Unadj. p-val and N have the same meaning as in Table 3. Each line corresponds to a separate regression. Attrition analysis and balance checks for the sample are provided in the second column of appendix Table E2.

Table 5—Student Working Groups' Composition: Effects on Social Interactions

	(1) C	$ \begin{pmatrix} (2) \\ \hat{\beta}_1 (T) \end{pmatrix} $	$\hat{\beta_1}$ s.e.	$\hat{\beta}_1$ p-val	$\hat{\beta}_2$ (TxShare)	$\hat{\beta}_2$ s.e.	$\hat{\beta}_2$ p-val	(8) N
Friendship Heterophily	0.066	0.113	0.073	0.120	0.268	0.127	0.035	2693
Number of friends	3.747	-0.002	0.197	0.992	0.340	0.241	0.158	2693
Nb of friends with 0 difference	1.512	-0.311	0.108	0.004	0.005	0.135	0.968	2693
Nb of friends with 1 difference or more	2.235	0.293	0.145	0.043	0.456	0.240	0.057	2693
Nb of friends with 2 differences or more	0.688	0.137	0.087	0.115	0.368	0.188	0.050	2693
Nb of friends with 3 differences or more	0.076	0.023	0.029	0.435	0.012	0.056	0.829	2693

Note: This table shows the results of regressing student friendship outcomes on a treatment dummy and on this treatment dummy interacted with the share of students with at least two differences in the working group. Column (1) displays the mean of the row variable in the control group; columns (2) to (4) respectively show the point estimate, standard error and p-value associated to the treatment dummy; columns (5) to (7) respectively show the point estimate, standard error and p-value associated to the treatment dummy interacted with the share of students with at least two differences in the working group. The last column displays the size of the analysis sample, namely students who are observed at endline and for whom working group composition is known. Each line corresponds to a separate regression. All regressions control for strata fixed-effects. Standard errors are clustered at the school level.

TABLE 6—TREATMENT EFFECTS ON CIVIC ATTITUDES AND DEMOCRATIC PARTICIPATION

	(1) C	(2) T-C	(3) S.E.	(4) Unadj. p-val	(5) Adj. p-val	(6) N
Civic Attitudes	0.000	0.102	0.033	0.002	-	4244
Social engagement	0.000	0.090	0.041	0.028	0.084	4244
Tolerance	0.000	0.027	0.031	0.375	0.375	4119
Equal rights	0.000	0.050	0.033	0.126	0.189	4110
Democratic Participation	0.000	0.084	0.033	0.011	-	4294
Political self efficacy	0.000	0.092	0.029	0.002	0.005	4241
Interest in political life	0.000	0.003	0.032	0.928	0.928	4294
Participation in Climate strike	0.000	0.068	0.039	0.081	0.121	4244
Civic Attitudes - projects unrelated to Social engagement	0.000	0.071	0.038	0.062	-	3469
Democratic Participation - projects unrelated to Social engagement	0.000	0.079	0.036	0.028	-	3509

Note: Columns C, T-C, S.E., Adj. p-val, Unadj. p-val and N have the same meaning as in Table 3. Each line corresponds to a separate regression. Attrition analysis and balance checks for the sample are provided in the second column of appendix Table E6. In the last two rows of the table, projects directly related to our social engagement measure are excluded from the analysis. More detailed results on this restricted sample are presented in appendix Table F4.

Table 7—Generalized Random Forests: Tests for Heterogeneity

	(1)	(2)	(3)	(4)	(5)	(6)
	Citizen.	School	Av.	Civic	Democratic	Friend.
	project	Behaviour	Grade	Attitudes	Part.	Heterophily
Heterogeneity	3.04	2.03	2.49	0.56	1.04	1.72
	(0.32)	(0.43)	(0.35)	(0.45)	(0.35)	(0.39)
Most importan	t variables:					
1	Teacher resp	Teacher resp	Int. in pol	Soc. Engag.	Teacher resp	Teacher resp
2	Soc. Engag.	Sport Grade	Sport Grade	Teacher resp	Pol. Self-eff	Friends diff geo
3	Pol. Self-eff	Pol. Self-eff	Female teacher	Equal rights	Int. in pol	Friends one diff
4	Int. in pol	Soc. Engag.	Soc. Engag.	Pol. Self-eff	Soc. Engag.	Nb friends

Note: For each outcome variable, the first row of the table shows the estimated coefficient of the regression of the conditional average treatment effect (CATE) on its causal forest estimate, following Chernozhukov et al. (2018). Rejecting the assumption that this coefficient is zero is tantamount to rejecting that the variance of the CATE is zero, i.e. rejecting that there is no heterogeneity in the effects of the treatment. The next rows show the four most important variables determining the heterogeneity of treatment effects (i.e., those that are most often used by the causal forest procedure to predict individual treatment effects), by order of importance.

Table 8—Treatment Effects by Teacher Baseline School Involvement

	(1) C	(2) T-C	(3) S.E.	(4) p-val	(5) N
High involvement					
Participation in a citizenship project	0.280	0.445	0.041	0.000	1999
School Behaviour	0.000	0.395	0.125	0.002	1045
Av. Grade	0.000	0.128	0.048	0.007	1045
Civic Attitudes	0.000	0.135	0.048	0.005	2065
Democratic Participation	0.000	0.143	0.048	0.003	2087
Participation in Climate strike	0.000	0.167	0.061	0.006	2063
Friendship Heterophily	0.000	0.214	0.056	0.000	2088
Teacher Pedagogy	0.000	0.392	0.241	0.104	136
Low involvement					
Participation in a citizenship project	0.319	0.443	0.050	0.000	2025
School Behaviour	0.000	0.030	0.132	0.817	1206
Av. Grade	0.000	0.181	0.060	0.002	1206
Civic Attitudes	0.000	0.046	0.069	0.505	2070
Democratic Participation	0.000	0.002	0.074	0.975	2098
Participation in Climate strike	0.000	-0.055	0.098	0.577	2072
Friendship Heterophily	0.000	-0.006	0.105	0.957	2102
Teacher Pedagogy	0.000	0.579	0.274	0.035	118

Note: Columns C, T-C, S.E., p-val, and N have the same meaning as in Table 2. Each line corresponds to a separate regression.