# Immigrating to Opportunity: The Effect of School Quality Using A Natural Experiment on Ethiopians in Israel\*

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**Abstract** 

In May 1991, fifteen thousand Ethiopian Jews were brought to Israel in an overnight airlift and sorted in a haphazard and essentially random fashion to absorption centers across the country. This quasi-random assignment produced a natural experiment whereby the initial schooling environment of Ethiopian children can be considered exogenous to their family background and parental decisions. We examine the extent to which the initial elementary school environment affected high school outcomes of Ethiopian children, using administrative panel data on the

educational career of each child in Israel through much of the 1990s. The results show that the

early school environment has an important effect on high school dropout and repetition rates and

on end-of-high-school matriculation exams. The evidence suggests that it is the quality of the

elementary school itself that is important for high school success, rather than other environmental

factors.

**Key Words**: school quality, peer effects, dropout rates

#### I. Introduction

How important is the environment faced by a young child – her family, her school, her teachers, her peers – in shaping her future outcomes? This is one of the central questions in the social sciences, yet providing a convincing answer has proved elusive, mainly because it is impossible (and in most cases ethically unjustifiable) to create the ideal laboratory conditions necessary to analyze the matter. Yet sometimes nature, institutions and political circumstances provide us with the means to address these crucial issues by way of a natural experiment. The sudden exodus of Ethiopian Jews to Israel in May 1991 during "Operation Solomon" represents such a natural experiment.

In the span of thirty-six hours, fifteen thousand Ethiopian immigrants were airlifted to Israel and were subsequently distributed into various absorption centers throughout the country. All available evidence suggests that the sorting of immigrants across the country occurred in an essentially random manner. This random sorting process created variation in the school placement of Ethiopian children, which was uncorrelated with the choices and family background characteristics of the children and their parents. In other words, some children ended up attending schools in wealthy Jerusalem suburbs, while others were less fortunate and were relegated to low socio-economic status development towns, far from the economic and cultural center of the country.

In this paper, we exploit the random assignment of immigrants to absorption centers to examine how the quality of the elementary school environment affected the long-term achievements of Ethiopian students in their high school years. The natural experiment provided by Operation Solomon allows us to avoid the typical difficulties posed by non-random selection of students into schools, which prevent researchers from identifying separately the effects of family background and the educational environment on student achievements.

Using panel data on a sample of Ethiopian children, we are able to track where Ethiopian children went to elementary school and follow them throughout their high school years. We measure the quality of the elementary school attended by Ethiopian children using the average scores on standardized mathematics and Hebrew tests a year prior to the wave of Ethiopian immigration. These measures are exogenous to the influx of Ethiopians into the school system, since they are measured just before the sudden and unexpected immigration wave. With this exogenous variation, we test whether elementary school quality is related to several different outcomes four to seven years later, when the students are supposed to be in high school. The particular outcomes we measure include the quality of the high school attended, dropping out at various stages in high school, advancing to various stages in high school without repeating a grade and passing the all-important matriculation exams, necessary to attend university.

The results show that attending elementary school with a good math program reduces the chances of a student dropping out of high school by 4.9 percentage points relative to an average dropout rate of 10 percent (a 50 percent decrease in dropout rates), and increases the passing rates on high school matriculation exams by 7.1 percentage points relative to an average of 27 percent (a 26 percent increase). In contrast, we find that attending elementary schools with good verbal programs has no effect on most of the high school outcomes. We conjecture that this is due to Ethiopian immigrants learning Hebrew in separate classes and with inexperienced teachers, so that the quality of a school's verbal program for regular students was inconsequential to an Ethiopian student's later scholastic achievement.

Overall, our results point to the importance of the early schooling environment in determining later outcomes. Ideally, we would like to identify which elements of the environment are important for high school success. The quality of instruction in elementary school, the quality of one's peers, the availability of learning opportunities in one's community outside the classroom (libraries, museums, extracurricular activities), and the labor market prospects faced by one's parents may all contribute to high educational achievements. These factors operate by motivating children, by instilling in them a passion for learning, by teaching them good study habits, and by providing a supportive and learning-friendly family environment. We attempt to disentangle these competing explanations by first estimating the simple relationship between our measures of school quality and high school outcomes, and then sequentially adding controls for the socioeconomic status of the Ethiopians' peers, and for a variety of other observable and unobservable characteristics of the school and the school district. Interestingly, our basic findings are insensitive to the inclusion of control variables for the socioeconomic status of one's peers or other characteristics of the community where one lives or attends school. This suggests that the driving force behind our results is the quality of instruction itself in elementary school, and not other environmental factors.

This paper is related to at least four important strands of empirical research. First, by looking at how the elementary school environment affects outcomes in high school, this paper contributes to the debate over whether investments in the early stages of a child's development have long-term payoffs. For example, Heckman (2000) argues that early investments in human capital for children have a larger payoff than interventions at a later stage, which aim to close the gap between troubled students and regular students. This argument is based on the idea that the early creation of human capital has a multiplicative effect by making it easier for children to develop more human capital throughout their childhood years. Some evidence for this claim is provided by Krueger and Whitmore (2001), who use data from the Tennessee STAR experiment and find that students who attended small classes in early grades were more likely to take college-entrance exams, and had somewhat higher test scores. Our analysis further substantiates

part of this claim by showing that the elementary school environment does have relatively large long-term effects in high school.

The second line of research related to our analysis looks at the role of peer effects in the creation of human capital. This literature examines whether students benefit from being in contact with better students (Arnott and Rowse, 1987; Sacerdote, 2001; Zimmerman, 2003). This question has also guided other researchers, who have looked at whether desegregation policies in the United States (such as bussing) help or hurt the achievements of blacks and whites (for example, see Hoxby, 2000a; Angrist and Lang, 2002; Hanushek, Kain, and Rivkin, 2002). In related work, the effect of neighborhood quality on a broad range of individual outcomes has been studied by Katz, Kling, and Leibman (2001). Their study uses random variation in the neighborhood placement of households to analyze the short-run effect on health, criminal activity, and behavioral problems. Our analysis uses a similar estimation strategy, since we exploit the random placement of Ethiopian families across Israel for our identification strategy, but our focus is on longer-term achievements in high school.

The third line of research related to ours concerns the broad issue of determining the effect of school resources on student success (see Burtless, 1996, for a wide range of views on the subject). Economists have investigated the effects of class size on student achievement, using data from both randomized (Krueger, 1999; Krueger and Whitmore, 2001), and natural experiments (Angrist and Lavy, 1999; Hoxby, 2000b); the effects of class size and teacher quality on the economic returns to schooling (Card and Krueger, 1992; Betts, 1995); the effects of teacher training and computers on pupil learning (Angrist and Lavy, 2001 and 2002); and the effect of teacher incentives on student achievement (Lavy, 2002a and 2002b). This paper contributes to this literature by focusing on school performance as an indicator of quality rather than measured inputs, by using a different identification strategy to estimate the effect of school quality on student outcomes, and by focusing on the long-term effects of the quality of the elementary school on outcomes in high school.

Finally, our paper also contributes to the large literature on the assimilation of immigrants in a host country (Borjas, 1995; Lalonde and Topel, 1997; and Schultz, 1998 for a survey of the US literature). The immigration wave of Ethiopian Jews to Israel (as opposed to the mass migration from the former Soviet Union) is similar in many aspects to migration waves from less developed countries to North America, Western Europe, and Australia. Our research can shed light on how the assimilation process and geographic dispersion of immigrants in the host country affects their educational and economic outcomes. In this respect, our work is similar to Edin, Fredriksson and Åslund (2003), who exploit a Swedish government initiative that exogenously distributed refugee immigrants across locations in order to investigate whether living in ethnic enclaves improves labor market outcomes.

The structure of the paper is as follows. The next section presents the historical background that preceded the exodus of Ethiopian Jews to Israel in May 1991, and describes in detail the "epic" story behind Operation Solomon. It also provides anecdotal evidence on how the new immigrants were sorted into housing and schools in a random fashion. Section III describes the data and the empirical strategy. Section IV tests for whether the data accord with the random placement of Ethiopian children into schools, as described in Section II. Section V presents the empirical estimates of the effect of elementary school quality on a variety of high school outcomes, Section VI tests the robustness of the results to the inclusions of other measures of the schooling environment, and Section VII discusses the magnitude of the effects. Section VIII concludes the paper.

# II. Operation Solomon: The Case for a Natural Experiment

# 1. Historical Background 1

Ethiopian Jews, who sometimes refer to themselves as *Beta Israel*, <sup>2</sup> claim to be the descendants of Menelik I, king of Ethiopia, son of the biblical King Solomon and the Queen of Sheba. While there is much debate as to the historical veracity of these claims, there is little controversy as to the fact that a community that identified itself as Jewish has lived in the region of Northern Ethiopia around Lake Tana for several centuries. Throughout most of their history, Ethiopian Jews had no contact with or knowledge of the rest of the Jewish world. Only around the 19<sup>th</sup> century did the existence of a community of black Jews in the heart of Africa arouse the interest of Christian missionaries and of European Jews, concerned with the survival of the *Beta Israel*. In 1867, Joseph Halevy was the first practicing European Jew to visit Ethiopia: his student Jacques Faitlovitch, who first visited Ethiopia in 1904, dedicated his life to the reintegration of the *Beta Israel* to the mainstream of Jewish life.

No attempt was made to bring the Ethiopians to Israel when the State was created in 1948. The first Israeli governments, together with North American Jewish groups, did provide some assistance for educational and health-care programs throughout the 1960s, but it was only starting in the late 1970s that the Likud-led government of Menachem Begin began to pursue a more positive attitude towards Ethiopian immigration. An important role in this change was the 1973 ruling of Israel's Sephardic chief rabbi, Ovadia Yosef, that the *Beta Israel* were in fact descendants of one of Israel's lost tribes, and were therefore entitled to migrate to Israel as full citizens under the Law of Return. This ruling was backed two years later by Israel's Ashkenazi chief rabbi, and transformed into law on April 25, 1975. Thus, Israel had become a viable home for those Ethiopian Jews who were willing to migrate. At roughly the same time, two other

<sup>&</sup>lt;sup>1</sup> This section is based on Kaplan (1992) and Wagaw (1993).

factors contributed to increase the push for migration: 1) the drought and consequent famine in Ethiopia, which became increasingly acute after 1973, and 2) the deposition of emperor Haile Selassie in 1974 and the installation of a Marxist-Leninist military junta led by Colonel Mengistu Haile Mariam, which led to a period of civil strife in Ethiopia. As a result, between 1977 and 1984, 7000 Ethiopian Jews migrated to Israel, and 6500 arrived via Sudanese refugee camps between November 1984 and January 1995 ("Operation Moses"). News of this operation leaked to the press, embarrassing the Ethiopian and Sudanese governments, and the venture was brought to an abrupt halt, leaving many Ethiopians stranded in Sudan, and the bulk of the *Beta Israel* (approximately 20,000-30,000 people) still in Ethiopia.

After 1985, a trickle of immigrants continued to arrive to Israel, mostly on a family reunification basis. After the resumption of diplomatic relations between Israel and Ethiopia in 1989, Ethiopian Jews began to emigrate to Israel in greater numbers: around 5000 Ethiopians arrived in 1990, while some twenty thousand had moved from the Gondar region to Addis Ababa, where they were placed in a temporary camp in the Israeli Embassy compound. At this time, Israel was planning to complete the exodus of the *Beta Israel* within two years in an orderly manner: the relatively small number of monthly departures would enable Israel to portray the operation as a limited family reunification plan, avoiding the suspicions of the Ethiopian population and the international community. However, military events in Ethiopia were overtaking political plans. In March 1991, it became common knowledge that the anti-Mengistu rebels were making steady gains in their struggle against government forces, and foreign residents in Addis Ababa were told by their embassies to leave the country. On May 21, 1991, Mengistu resigned the presidency and fled the country for Zimbabwe. On Friday May 24, minutes before the rebels took over Addis Ababa, the emergency rescue of Ethiopian Jews was underway.

During thirty-six hours between May 24 and May 25, 1991, over fourteen thousand Ethiopian Jews were airlifted to Israel in "Operation Solomon." Thirty-three aircrafts were used in the course of the operation. One of the Boeing 747 aircraft set a world capacity record when 1,180 passengers somehow found space on a plane built for 400. The Boeing 707s carried up to 500 passengers. In all, 40 round-trips were flown from Tel Aviv to Addis Ababa. During one 30-minutes period late Friday night, no less than 2,900 immigrants arrived in Tel Aviv. (Jerusalem Post, May 31, 1991).

The day and a half journey that started in the streets of Addis Ababa and ended in temporary housing locations in Israel determined the schools the immigrants' children would

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<sup>&</sup>lt;sup>2</sup> Literally, the House of Israel.

attend just a month later. We will claim below that the course of events in this brief journey led to a random assignment of pupils to schools in Israel.

## 2. Randomness in the Airlift from Addis Ababa to Tel Aviv

The call for Jews to assemble at the Israeli Embassy compound was issued at dawn, May 24. The initial trickle quickly became a flood, as Jews streamed in from the four neighborhoods in which they had been living in rented quarters. "After passing through the checkpoints, the immigrants were led aboard buses which transported them some 15 kilometers to the military wing of Addis Ababa's airport. The immigrants were not allowed to carry with them any belongings and they left behind all their bags and luggage, both for security reasons and because every inch of space on the planes was needed," (Jerusalem Post, May 22, 1992). This and other casual evidence suggest that the scene at the embassy compound was one of chaos, where thousands of people were trying to make their way to the buses without order, without a pre-prepared list of evacuees and without any rules of boarding priority.<sup>3</sup> Zimna Berhane, an Ethiopian-born Jewish Agency official who was the main organizer of the Ethiopian Jews living in the Embassy compound, said that "all of Addis was there, and that the scene was reminiscent of Saigon in the days before its fall to the communists. (Jerusalem Post, May 26, 1991).<sup>4</sup>

This description of events at the embassy suggests that the boarding of buses at the embassy did not take place according to any particular order. This fact is very important for our study because the random order of boarding the buses determined also the order in which immigrants boarded planes, the timing of landing in Tel Aviv, the order in which they were bused out of the airport in Tel Aviv and the specific absorption center they were sent to. However, even though the initial randomness was triggered in the embassy compound in Addis Ababa, additional chaos and random grouping of the immigrants were added along the way.

The embassy staff was under orders to keep up a sufficient flow of evacuees to the airport so that there would always be a reserve at the airport to fill planes as quickly as they landed (Jerusalem Post, May 26, 1991). Yet, the boarding process at the airport was initially difficult as evident from the following quote from an Israeli soldier whose job was to escort the busloads to the planes in Addis: "At first the soldiers asked their charges to come forward in small, manageable groups as they prepared to approach the planes. It didn't work. When we asked a few to stand up, they all stood up, hundreds. Then we'd ask them to sit down again, and without a

<sup>&</sup>lt;sup>3</sup> Micha Feldman, a Jewish Agency official who helped oversee operation Solomon recall: "There was no order, and as word of the operation spread, thousands of Ethiopians Jews and their neighbors, swarmed to the embassy compound. We weren't able to move. We couldn't register anyone as hundreds of non-Jews came to watch the show. We couldn't get people into the embassy and on the buses because thousands of people were in the way. I gave the order to my people to use force to clear the path." (The Jerusalem Post, 22 September 1991).

<sup>&</sup>lt;sup>4</sup> There is also evidence that many non-Jewish Ethiopians asked or tried to board the buses and planes.

word, boom, down they sat. Finally someone had the idea to take a rope, just a simple rope, and cordon off about 40 people. Then we'd ask only these to come with us, toward the plane. Worked like magic". (Jerusalem Post, May 31, 1991).

## 3. The Placement in Absorption Centers

With the landing of each plane in Tel Aviv, several buses pulled out from a parking lot inside the airfield where 250 other buses were waiting, picked up the newcomers, and took them to absorption centers. The Jewish Agency had opened 40 "emergency absorption centers" in hotels and caravans to supplement its existing 50 absorption centers and make room for the immigrants (Jerusalem Post, May 26, 1991). The newcomers were taken to absorption centers as far away as Eilat in the south or Kiriat Shmona in the north. Many of those placed in hotels were moved within a few months in groups to caravan parks that were set up, in most cases nearby, as a solution to the overcrowding in the hotels that served as the Ethiopian immigrants' first homes in Israel.

The immigrants were placed into absorption centers in order of their arrival and there is plenty of evidence to suggest that they could not affect the place they were sent to. Even those who had close relatives (children, parents) in Israel did not get to be placed near them.<sup>7</sup> Nor could the relatives already in Israel influence the placement outcome of their immigrant relatives.<sup>8</sup>

The immigrants of Operation Solomon remained in mobile home camps much longer than the government initially planned. The Shamir government's initial target date of July 1993 to

<sup>&</sup>lt;sup>5</sup> The majority of the immigrants, over 7,000, were sent to centers in the north, 3,000 to Jerusalem and the southern region, and around 1,000 to the Tel Aviv area. Tiberias was the city that absorbed the largest number of Ethiopian immigrants, some 2,200, followed by Jerusalem with 1,800, Ashkelon with 1,200, and Nahariya with 1,000. (The Jerusalem Post, Friday, May 31, 1991).

<sup>&</sup>lt;sup>6</sup> "Because of the pressing need to move large numbers of people out of hotels quickly, the caravan sites were established all over the country, whether or not employment opportunities existed in those areas" (A quote from an article by Sue-Fishkoff who interviewed Ya'acov Babu, spokesman for the Unite Organization of Jews from Ethiopia. The Jerusalem Post, May 22, 1991). An example is the story of some 1,400 immigrants that were placed at the Diplomat Hotel in Jerusalem, the highest number in any one hotel in the country. By December 1991 all of them were placed in mobile homes sites all over the country. (The Jerusalem Post, December 20, 1991).

<sup>&</sup>lt;sup>7</sup> A typical story is that of Fantu Atrash, 55, who arrived during Operation Solomon operation from a village in the Gondar region. Atrash had many relatives in Netanya, Tiberias and Ashkelon, all from the same region in Gondar, but she was placed in Safed in the north of Israel even though she would have liked to be near her relatives. (The Jerusalem Post, August 23, 1992). Another story is that of Dessta Tadla, a single mother to five children, who was also placed in Safed although she would have preferred to live near her uncle in Rishon Lezion (The Jerusalem Post, August 23, 1992).

This is evident from the following quotes: "The Jewish Agency has asked veteran immigrants to not go to the absorption centers looking for relatives until at least Tuesday, so workers will be able to concentrate on finishing the initial absorption of the 14,400 Jews airlifted here in Operation Solomon. Within the next few days, the Agency would come up with a computerized list of newcomers...In the meantime, the names and whereabouts of some new arrivals have already begun to be announced on Israel radio's Amharic service each evening..." (The Jerusalem Post, May 27, 1991). Even Jewish Agency staffer Ginette Afgas, 29, who had been hoping that her brother, whom she had not seen for 18 years, would be among the group coming to Hotel Carmeliya, Haifa, found that he had apparently been directed elsewhere, and she had to postpone her eagerly awaited reunion.

complete the move to permanent housing was abandoned, as the new Rabin government in 1992 abrogated all commitments that had been previously made to the Ethiopians (Kaplan and Rosen 1994, page 83). In early 1993, the government announced that it would take three to four years before all of the caravan sites could be evacuated. The length of stay in the initial housing has direct bearing on the main issue analyzed in this paper, the effect of elementary school quality on later schooling outcomes, because it implies that pupils who enrolled in September 1991 remained in the same school for an average period of at least 3-4 years.

## 4. The placement in schools

The Ministry of Education and the absorption authorities decided to place elementary school pupils in neighborhood schools, or in the nearest religious schools. This policy was stated publicly by the Ministry director general just before the 1991-1992 school year started: "All pupils aged six to 17 will be moved into regular schools on September 1. Elementary school pupils will be studying in schools in their neighborhoods, while pupils aged 12-17 will study in dormitory facilities. Most students, as expected, will be studying in state religious schools, though some will have their classes located in state secular schools, due to a lack of space in the religious institutions. But despite their location in secular schools, their studies will be conducted under the auspices of the state-religious system. This is a policy agreed upon by the government, the Jewish agency, and the religious leadership of the Ethiopian community" (Jerusalem Post, August 30, 1991). 10 Another piece of evidence revealing the policy to place immigrant students in the nearest religious elementary school is found in a quote from Ora Donio, deputy general manager of the Jewish Agency's immigration department: "While there are no schools in any of the caravan parks, immigrant children walk or are bused to nearby schools outside the sites." (Jerusalem Post, May 22, 1992). In most schools the Ethiopian pupils were integrated in regular classes though there were cases of segregated classes for Ethiopians. 11 To sum up, there is an abundance of anecdotal evidence suggesting that the initial placement of Ethiopians in absorption

<sup>&</sup>lt;sup>9</sup> There is casual evidence suggesting that the stay of Ethiopian immigrants in caravan sites was prolonged by their hesitation to move to permanent housing by buying apartments or houses. Explaining why immigrants seemed hesitant to buy their own homes, a government official said "many Ethiopians have the attitude that the government brought us here, the government will provide us with housing. We won't be thrown out onto the street, so why complicate things with mortgage payments" (The Jerusalem Post, February 21, 1992).

<sup>&</sup>lt;sup>10</sup> The decision to place Ethiopian pupils in state religious schools, based on the assumption that it would ease the transition for immigrants from a traditional religious background, was applied not only in elementary schools but in secondary level boarding schools as well. Although parents were permitted to transfer a child to any school after the first year, in practice this seldom occurred (Kaplan and Rosen, 1994).

<sup>&</sup>lt;sup>11</sup> The following quote provides evidence on this policy: "In most cases, new immigrants are scattered through the school system, usually without large enough concentration in individual schools to warrant separate classes. In this situation, the new immigrants are placed in classrooms with veteran Israeli children and have a few hours of separate lessons to help them learn Hebrew. When they are concentrated in large numbers, we can have separate classes for them until they learn enough Hebrew and are ready to be integrated" Tova Azoulay, Ministry of Education and Culture deputy spokesperson, (The Jerusalem Post, June 1, 1991).

centers and schools was as good as random. In the next sections, we will describe the data, and provide empirical support for what was described above as a random process did indeed lead to an orthogonal relationship between students' background characteristics and the quality of the schools they were assigned to.

#### III. Data and Empirical Framework

The primary question posed in this paper is whether Ethiopian immigrant children who were placed in a better primary school achieved better high school outcomes. In general, answering such a question is non-trivial due to the non-random assignment of children to schools, either because of the choice of schools exercised by children and their parents or because of endogenous matching of pupils to schools done by education authorities. These behavioral decisions lead very often to the sorting of pupils to schools by ability and by socio-economic background. As a result, the observed strong correlation between measured school quality and the scholastic achievements of pupils does not necessarily represent a causal connection. In addition, answering this question suffers from Manski's "reflection problem" (Manski, 1993), whereby the researcher tries to to infer whether the average behaviour in some group influences the behaviour of the individuals that comprise the group. The challenge of neutralizing the causal effect from student quality to school quality in order to identify the causal effect in the opposite direction is very difficult.<sup>12</sup>

In this study, we explore a unique opportunity to overcome these estimation problems, by implementing an empirical strategy that exploits random variation in the primary school placement of Ethiopian children during their first few years after immigration. This unique historical episode allows us to solve the usual problem confronted when using observational data for evaluation, namely that of an unobserved counterfactual. Ideally, to estimate the effect of school quality on student outcomes, we would like to observe both the outcome of the student if she had attended the good school, and the counterfactual, her outcome if she had attended the inferior school. Clearly, however, a student is observed only in one type of school, and not both of them simultaneously. If, however, we could randomly assign students to good or inferior schools, the unobserved counterfactual problem would be resolved, since the distribution of potential outcomes conditional on actual assignment to the good school would be identical to the distribution of potential outcomes in the population. <sup>13</sup>

<sup>&</sup>lt;sup>12</sup> The reflection problem is particularly acute if the regressor of interest is measured contemporaneously with the outcome variable. In our particular data set the reflection problem might not be as relevant, since we use predetermined test scores as our measure of school quality.

The counterfactual framework was pioneered by Rubin (1974) and since adopted by many in both statistics and econometrics, including Rosenbaum and Rubin (1983), Heckman (1992), Imbens and Angrist (1994), Angrist, Imbens and Rubin (1996), Manski (1996), Heckman, Ichimura and Todd (1997), and Angrist (1998).

In the absence of actual physical randomization, the next best strategy is to take advantage of quasi-randomizations ("natural experiments") generated by special institutional or political circumstances. The May 1991 Ethiopian immigration wave produced exactly such a natural experiment that allows us to exploit variation in school quality that is exogenous to the characteristics and choices of students, parents, and policy makers. Consequently, we are able to use this random school placement of Ethiopian students to identify the counterfactual effect of changing the student's school quality.

## 1. Empirical Framework

Formally, consider a simplified model in which schools can be classified as either "high" or "low" quality. Define  $y_{il}$  and  $y_{i0}$  as the potential outcomes of individual i if she attends the high quality or low quality school respectively; let  $d_i$  be the treatment indicator ( $d_i$  is equal to 1 if individual i attends a high quality school and zero otherwise); and let  $y_i$  be the observed outcome for individual i,  $y_i = d_i y_{il} + (1-d_i) y_{i0}$ . We are interested in estimating the causal effect of attending a high quality school. The average treatment effect is

$$\alpha = E(y_{i1}) - E(y_{i0}) .$$

If students were truly assigned randomly to schools,  $y_1$  and  $y_0$  would be independent of the treatment indicator, so that

$$E(y \mid d = 1) = E(dy_1 + (1 - d)y_0 \mid d = 1) = E(y_1)$$

and

$$E(y \mid d = 0) = E(dy_1 + (1 - d)y_0 \mid d = 0) = E(y_0).$$

Hence, the average treatment effect can be calculated as the simple difference in mean outcomes between students in high quality and low quality schools. We maintain the weaker assumption of conditional random assignment: the potential outcomes are independent of the treatment indicator, conditional on a set of covariates  $\mathbf{x}$ . This assumption allows for the possibility that the allocation of families to absorption centers was in some way affected by background characteristics (parents' education, family size), but that for immigrants with identical backgrounds the allocation was as good as random.

Conditional independence implies conditional mean independence:

$$E(y_0 \mid \mathbf{x}, d) = E(y_0 \mid \mathbf{x}), \text{ and } E(y_1 \mid \mathbf{x}, d) = E(y_1 \mid \mathbf{x}).$$

This in turn yields

$$E(y \mid \mathbf{x}, d) = E(y_0 \mid \mathbf{x}, d) + d\{E[y_1 \mid \mathbf{x}, d] - E[y_0 \mid \mathbf{x}, d]\}$$
  
=  $E(y_0 \mid \mathbf{x}) + d\{E[y_1 \mid \mathbf{x}] - E[y_0 \mid \mathbf{x}]\}$ .

Therefore, the average treatment effect for a given value of the vector  $\mathbf{x}$  can be estimated by the simple difference in means between the treated and the control groups with covariates equal to  $\mathbf{x}$ . To calculate the average treatment effect, we need to average over all possible values of  $\mathbf{x}$ . This can in theory be done non-parametrically with a multitude of data, but given that in our case  $\mathbf{x}$  is high-dimensional, we will follow a different approach.

We first decompose the potential outcomes into their means and a stochastic component:

$$y_{i1} = \mu_1 + v_{i1}$$
$$y_{i0} = \mu_0 + v_{i0}$$

with  $E(v_{ij}) = 0$ , for j=1,2. We further assume that the conditional mean of the stochastic components is identical for the treated and the control group, and can be expressed as a function of the x's, linear in its parameters.

$$E(v_{i1} | x_i) = E(v_{i0} | x_i) = \eta_0 + h(x_i')\beta_0.$$

Then, some simple algebraic manipulations yield that the conditional expectation of the observed outcome  $y_i$ , conditional on the control variables and the treatment indicator  $d_i$  is

$$E(y_i | x_i, d_i) = (\mu_0 + \eta_0) + \alpha d_i + h(x_i')\beta_0.$$

This basic result extends to continuous treatment variables (such as the measure of school quality we use in our regressions) if we make the assumption of a constant additive treatment effect. Therefore, a simple least squares regression of the observed outcome on the treatment indicator and the control function will yield a consistent estimate of the average treatment effect. In practice, we use a statistical regression model:

(High School Outcome)<sub>ij</sub> = 
$$\lambda_0 + \alpha$$
 (Elementary School Quality)<sub>j</sub>   
  $+ \lambda_1$  (Family Background)<sub>i</sub>   
  $+ \lambda_2$  (Neighborhood Quality of School  $j$ )<sub>j</sub> +  $u_{ij}$ 

where we have included family background variables and neighborhood characteristics as our control variables. In addition, since most of our dependent variables are binary, we will use the probit model for estimation.

#### 2. Data

Implementing the empirical strategy outlined above requires rich information of a panel nature: the primary school a pupil attends at a young age, the quality of that school and the characteristics of its surrounding community, measures of the pupil's progression through middle and high school, the scholastic achievements in the matriculation exams toward the end of high school, as well as measures of family background. We are able to construct such a panel using

administrative data from the Israeli Ministry of Education and results from a national testing wave carried out in 1991.

The first year of data is for the 1993-1994 school year, which is two years after the large wave of Ethiopian immigration. The sample includes all Ethiopian children from the May 1991 immigration wave who were in fifth grade in the 1993-1994 school year (532 students), as well as all other fifth-grade students in the country, for a total of about 70,000 observations. We are able to follow each student in the studied cohort from fifth grade throughout the advanced stages of high school, until the 2000-2001 school year, when this cohort was scheduled to finish twelfth grade if they had progressed through the system without repetition. The administrative data contains information on the country of birth and date of immigration (month and year) of the children and their parents: this enables us to precisely identify pupils of Ethiopian origin who arrived in May 1991. The data also includes an identifier of the school each child attended in fifth grade, parental schooling and family size, time series information on students' progression through various grades until an event of dropping out or high school completion, as well as information about whether the pupil obtained a matriculation diploma at the end of high school. In addition, we were able to collect matriculation exams data for the 2001-2002 school year for the subsample of Ethiopian students who were enrolled in 11<sup>th</sup> grade in 2000-2001, i.e., students who had repeated one grade, and were lagging behind their cohort in the schooling cycle. <sup>14</sup> This allows us to have an almost complete picture of matriculation rates for Ethiopian students. This is particularly important, since in Israel the high school matriculation exam - known as the "Bagrut" – is a pre-requisite for admission to universities and is one of the most economically important education milestones. Similar high school matriculation exams are found in many countries and in some American states. Examples include the French Baccalaureate, the German Certificate of Maturity (Reifezeugnis), the Italian Diploma di Maturità, the New York State Regents examinations, and the recently instituted Massachusetts Comprehensive Assessment System.

#### 3. Measuring School Quality

To measure school quality we use data on the average grades for the 4<sup>th</sup> and 5<sup>th</sup> grade students in each elementary school on the math and verbal tests carried out nationally in the 1990-1991 school year.<sup>15</sup> This measure of school quality has at least two distinct advantages. First, by using school quality from 1990-1991, which is one year before the unexpected mass wave of Ethiopian immigrants, our measure of school quality is completely exogenous to the

<sup>14</sup> At the time of the writing of this draft, the Ministry of Education had not yet released the full data on matriculation exams in 2001-2002.

<sup>&</sup>lt;sup>15</sup> This is the same data used in Angrist and Lavy (1999).

absorption process of Ethiopian children into schools, as required by our empirical strategy. Second, we are able to use student outputs as a direct measure of quality, rather than imperfectly measured and debatable school inputs.

The average scores of 4<sup>th</sup> and 5<sup>th</sup> graders within each elementary school are likely to be good indicators of school quality. However, the average performance of each cohort alone may also be affected by idiosyncratic shocks, such as compositional changes of students' background or innate ability. Therefore, aggregating the 4<sup>th</sup> and 5<sup>th</sup> grades scores together within the school may reflect more accurately the systematic part of school quality. Since the test in each subject and across grades is not comparable, simply averaging them is not appropriate. Therefore, we adopt alternative approaches for aggregating the scores across cohorts, which are discussed in the next section.

#### 4. Summary Statistics

In Figure 1, we show the distribution of Ethiopian children in Israeli elementary schools by immigration date. <sup>16</sup> The figure illustrates the dramatic nature of the May 1991 immigration wave. The number of immigrant children who arrived in May 1991 (1,793 pupils in 1<sup>st</sup>, 2<sup>nd</sup> and 5<sup>th</sup> grades) is more than ten times larger than the number of immigrants who arrived in any other month, and altogether May 1991 immigrants account for about 40 percent of all Ethiopians in the Israeli school system.

Table 1 presents summary statistics of the data for our primary sample of Ethiopian students who immigrated in May 1991, and also for three other sub-samples of interest: Ethiopians who immigrated in the 1980s, immigrants from the Soviet Union, and the rest of the Israeli Jewish population. Table 1 also presents the elementary school quality measures discussed above (average scores for the 4<sup>th</sup> and 5<sup>th</sup> grade students on the 1991 standardized math and verbal tests), a 1991 socio-economic index of students in each elementary school (before the Ethiopian immigrants from Operation Solomon were enrolled in Israeli schools), the religious status of each school, <sup>17</sup> and the percentage of Ethiopians in the class and grade.

Table 1 reveals that Ethiopian immigrants from the 1991 wave typically went to underachieving schools with students of a lower socio-economic background. This result is not surprising since they were not placed in particularly high-income areas where the best schools are likely to be. However, this result does not violate the crucial exogeneity assumption necessary for identifying the treatment effect, represented by the elementary school environment. The random assignment assumption does not require that Ethiopians were placed in a random sample of

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<sup>&</sup>lt;sup>16</sup> The data refers to grades 1, 2 and 5, the only grades for which we have data on the universe of pupils enrolled in the school system.

<sup>&</sup>lt;sup>17</sup> The Israeli public school system includes religious (25%) and secular (75%) state schools.

Israeli schools, but requires only that the distribution of Ethiopians across schools was independent of the Ethiopians' own choices, abilities, background, etc. Figures 2 and 3 show that Ethiopians were placed in a sample of schools that closely represents the distribution of schools for all the other students. These figures show that, although Ethiopians were placed in lower achieving schools on average, the distribution of schools had a very broad and representative range of quality.

Comparing column 1 to columns 2-4 in Table 1 reveals that the May 1991 Ethiopian immigrants went to better schools than the children of Ethiopian families from earlier immigration dates, but not as good as the schools attended by former Soviet Union immigrants. This reflects the fact that veteran Ethiopians over the years tended to settle in low housing cost communities which also have lower quality schools, while many of the former Soviet Union immigrants chose to live in large and central metropolitan areas.

Ninety two percent of the Ethiopian fifth graders who immigrated in May 1991 studied in religious schools, higher than the respective proportion among immigrants who arrived in the 1980s (upper panel in Table 1). This reflects the official government policy discussed in the previous section. Also important to note is the high average proportion of Ethiopians placed within the same class (32%) or grade (27%) for the May 1991 immigrants.

The measures of student's family background presented in the second panel of Table 1 include the education levels of both parents, number of siblings, and age while attending fifth grade. Table 1 reveals stark differences in levels of parental education between the Ethiopians and the rest of the population. Parents of Ethiopian children typically had 1 or 2 years of education, compared to an average of over 11.5 for parents of Israeli Jewish children in fifth grade. Table A1 in the Appendix reveals that these numbers are not unusual for the Ethiopian population – average schooling in Ethiopia for 1990 was one year. Consequently, our sample reflects the expected differences in parental background between Ethiopian children and their peers. Parental schooling of Ethiopians who immigrated during the 1980s is higher than that of the May 1991 Ethiopians, albeit still substantially lower than that of natives and Russian immigrants.

The bottom panel of Table 1 presents the means for the various measures of high school outcomes: whether or not the student ever attends various grades, whether the student reached a given grade without repeating, whether the student drops out of school before completing 12<sup>th</sup> grade, whether the student passed the matriculation exams, and the quality of the high school attended (measured by the average matriculation rate for students between 1996 and 1998). Not

<sup>&</sup>lt;sup>18</sup> This is calculated from the reported year of birth in the Ministry of Education data. This variable may be problematic since many Ethiopians did not know their exact date of birth, as the Ethiopian calendar differs from that used in the West both with regards to the months and years.

unsurprisingly, the high school educational outcomes of Ethiopian students are significantly lower than their peers for most outcomes. For example, only 23 percent of the Ethiopians passed their matriculation exams by the end of the 2000-2001 school year compared to 58 percent for Israeli Jews and 50 percent for Russian immigrants.

However, there is ample evidence that the main difference between new Ethiopian students and their peers is that Ethiopian children are much more likely to repeat a grade. <sup>19</sup> For example, only 67 percent of the Ethiopian sample made it to 10<sup>th</sup> grade without repeating a grade compared to 94 percent for Israeli Jews, while 92 percent of the Ethiopians did eventually make it to 10<sup>th</sup> grade compared to 96 percent for Israeli Jews. Similar results are found for twelfth grade: only 10 percent of Ethiopians drop-out before completing 12<sup>th</sup> grade compared to 9 percent for Israeli Jews; only 65 percent of the Ethiopians reach 12<sup>th</sup> grade without repeating a grade, compared to 89 percent for Israeli Jews.

Because of the large incidence of grade repetition for Ethiopians, it is important to keep in mind that some of our measures concerning achievement in twelfth grade, such as passing matriculation exams, ever attending 12<sup>th</sup> grade, or dropping out before completing 12<sup>th</sup> grade are heavily influenced by the delays of Ethiopian students in actually making it to 12<sup>th</sup> grade. <sup>20</sup> The reason is that our data includes information on all pupils only up to the end of the 2000-2001 school year, the year in which the 5<sup>th</sup> grade cohort of 1993-1994 is supposed to graduate from 12<sup>th</sup> grade if it does not repeat a grade. That is, perhaps the percentage of Ethiopian students finishing 12<sup>th</sup> grade and passing the matriculation exams will not be so much worse than their peers once we allow for them to actually make it there with a one or two year lag. Conversely, the estimate of the dropout probability for Ethiopians may be biased downwards, since a student who attends 10<sup>th</sup> or 11<sup>th</sup> grade in 2001 and drops out subsequently would be incorrectly classified as still in school according to our data.<sup>21</sup>

#### IV. Empirically Testing for Random Assignment

In Section II we described in detail the process that brought thousands of Ethiopian Jews to Israel in the space of 36 hours in the course of Operation Solomon, and argued that all available evidence indicates that the assignment of immigrants to absorption centers across the country,

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<sup>&</sup>lt;sup>19</sup> The relatively low high school achievements of the Russian immigrants, such as only 86 percent ever attending 10<sup>th</sup> grade, are likely to reflect migration of Russians out of Israel to other countries rather than the true drop out rate. This is not likely to be a problem for Ethiopian immigrants, but comparing outcomes with Russian immigrants may be problematic for this reason.

<sup>&</sup>lt;sup>20</sup> Repeating a grade for Ethiopians is not necessarily as bad a signal about achievements as it is for non-Ethiopians. In fact, repeating a grade after immigration may eventually be more beneficial to an Ethiopian child than being passed along after a marginal performance stemming from problems of adapting to a new language and environment.

<sup>21</sup> We only have data for 2001-2002 for the sample of May 1991 Ethiopians: in the regression analysis we will use

We only have data for 2001-2002 for the sample of May 1991 Ethiopians: in the regression analysis we will use the complete data for this sample, while in Table 1 we restrict the analysis to the data available for the 2000-2001 school year for the sake of comparability with other sectors of the population.

and consequently the assignment of children to schools, was performed in a totally chaotic and random fashion. In this section, we test whether the anecdotal evidence finds confirmation in the data.

Specifically, we test whether there is a significant relationship between the observable characteristics of Ethiopian children and the type of school they attended. This can be done by estimating regressions of the various measures of the student's elementary school environment on various measures of their family background. If the assignment was indeed random, we expect to find no such significant relationship. This is not necessarily a proof of random assignment, as the assumption requires there to be no correlation between school quality and both observable and *unobservable* background characteristics. However, the lack of a significant relationship between school quality and observables suggests that it is unlikely that such a relationship exists between school quality and unobservables. The results of these tests are presented in Table 2.

Each coefficient in Table 2 represents the estimate from a single regression for each of the various measures of the elementary school environment on one of the measures of family background. For example, the first column represents the results of eight separate regressions for the eight measures of the elementary school environment, when the explanatory variable in each regression is father's years of schooling. In addition to the school characteristics presented in Table 1 (average math scores, average verbal scores, and the school mean socioeconomic index), we also use other characteristics of the school environment, including income per capita, the matriculation rate, rate of population on welfare, rate of the labor force receiving unemployment benefits and the dependency ratio<sup>22</sup> in the town or regional council the school is located in.

The first column of Table 2 reveals that father's schooling is not significantly correlated with any measure of the school quality or community environment measures. The robust t statistics (adjusted for clustering) reported in parentheses are mostly below 1, indicating essentially no relationship between indicators of school quality and father's education. The second column of Table 2 indicates that mother's schooling is also not correlated with school quality and community measures, although it does seem to be correlated with the socioeconomic index of the students and the percent of unemployment recipients in the community. As for the other three personal characteristics (sex, number of siblings and age), they are largely uncorrelated with any of the school quality or community environment measures.

Overall, the results in Table 2 do not suggest any systematic pattern in the school placement of Ethiopian children according to their family background. With only a few exceptions, the t-statistics for the all the coefficients in Table 2 are well below 1; only in four

<sup>&</sup>lt;sup>22</sup> The dependency ratio is defined as the ratio of the population of children (under 15) and elderly (over 65) to the working age population.

cases out of forty estimates presented in the table are the t statistics above the level of marginal significance.

These results are in accordance with our expectations, and substantiate our claims about the random nature of the placement of immigrants in temporary housing, as described in the previous sections. It is worth emphasizing that the regressions find no correlation between background characteristics and the quality of schools attended by Ethiopians in the 1993-1994 school year, two full years after Operation Solomon. Contributing factors that helped keep the initial assignment unchanged for a few years is the limited education of the Ethiopian immigrants in combination with their limited understanding of Hebrew and the Israeli bureaucracy. As noted in footnote 9, another factor that limited very much the move of Ethiopian families from their initial temporary housing was their hesitation to take a mortgage to finance the purchase of apartments or houses. Given these obstacles, it is easy to understand why Ethiopian parents had very little involvement in the choice of their child's school in the first few years after their immigration. Naturally, we expect that Ethiopian parents would have gradually learned some Hebrew and learned more about the Israeli education system, so that the placement of children into schools would be less random over time. Table 3 examines this issue directly by studying whether parental schooling levels are associated with school quality for other samples in the population.<sup>23</sup>

The first column in Table 3 replicates, for ease of comparison, the results from Table 2 for the May 1991 Ethiopian immigrants. The second and third columns show, respectively, the results for the prior wave of Ethiopian immigrants from the 1980's and for the Russian immigrants, who immigrated roughly at the same time as the 1991 Ethiopians. In these two samples, parental education levels are highly correlated with elementary school quality. In addition, the bottom panel of Table 3 shows that, for all three groups, parental background is strongly correlated with school quality as the cohort reaches their high school years. This finding confirms our expectation that educated parents of Ethiopian children learn over time how to place their children into better schools, just like other sectors of the population.

The comparison between the first three columns in Table 3 demonstrates just how unusual the sample of 1991 Ethiopian immigrants appears to be as of 1993: they are the only sub-sample that is not strongly sorted into better elementary schools according to parental background, despite displaying very strong sorting later on in their high school years. These findings clearly demonstrate that the apparent "random sorting" into elementary schools is not due to the low mean and variation in education levels of Ethiopian parents, since the same sample of Ethiopians displays strong sorting later on in high school. In addition, this possibility is further refuted by the

strong sorting into elementary schools by the prior wave of Ethiopian immigrants (second column), who also had extremely low levels of education. Furthermore, the evidence in favor of random sorting into elementary schools is not due to the fact that the Ethiopians had been in Israel for only a short period, since we do find strong positive sorting for the sample of former Soviet Union immigrants, who arrived at roughly the same time. Nor can the differences across groups in elementary school be explained by the smaller standard errors for the non-Ethiopian sub-groups as a result of much larger sample sizes – since this cannot explain the large differences in the sizes of the coefficients in elementary school (as well as the occasional unexpected negative sign for 1991 Ethiopians).

The last column in Table 3 shows that average math and verbal scores of primary schools are highly and positively related to the education levels of both parents of native Israeli Jewish children. This result is to be expected since native families have already self-selected themselves into schools according to their family income, educational background, ethnic group, etc. These results point to why it is so difficult to estimate the effect of the schooling environment on the performance of students: it is impossible to know whether this very strong correlation is due to a causal effect, or whether it stems from selective sorting, or whether it exhibits the "reflection" problem described in Manski (1993).

Overall, the results in Table 2 and 3 illustrate that 1991 Ethiopian immigrant children were sorted across schools in an essentially random manner. In addition, Figures 2 and 3 show that Ethiopians were sorted into schools that reflect the whole population of Israeli schools. Therefore, we not only have exogenous variation to exploit, but a considerable level of variation as well.

## V. The Effect of the Elementary School Environment on High School Outcomes

Given that it seems justified to assume that the Ethiopians from the 1991 immigration wave were randomly sorted across schools, the aim of this section is to examine if the random variation in school quality can explain variation in our measures of individual-level high school outcomes described in Section III.

#### 1. Assuming a linear effect of school quality

Using the sample of Ethiopian immigrants from the 1991 wave who were in fifth grade in the 1993-1994 school year, Table 4 presents the basic results for how measures of school quality affected high school outcomes. The first two columns use the average math scores for 4<sup>th</sup> and 5<sup>th</sup> graders, a year prior to the Ethiopian immigration wave of 1991. Since these tests were not

<sup>&</sup>lt;sup>23</sup> Table 3 presents the same tests for balancing for the other sub-populations in Israel only for parental education.

comparable, we aggregated them in two ways. First, we simply standardized them by their mean and standard deviation and computed their means across the two grades for each elementary school. Second, we take the average percentile rank across grades within each school, since the percentile rank should be a comparable measure of school performance across grades. The last two columns do the same for the verbal scores of 4<sup>th</sup> and 5<sup>th</sup> graders in each elementary school. Each row and column in Table 4 represents a different probit regression. For example, the coefficient (0.015) in the first row and column represents the marginal effect from a probit on whether the student ever attended 10<sup>th</sup> grade on the elementary school's average standardized math score. All of the probit regressions control for father's years of schooling, mother's years of schooling, a gender dummy, age while attending fifth grade, number of siblings (0 if unknown), a dummy for whether the number of siblings is unknown, and a dummy for whether the elementary school was religious.

According to the table, the marginal effect of the average math score on the probability of ever attending 10<sup>th</sup> grade is 0.015, which means that a one standard deviation change in the average math score of the school leads to a 1.5 percentage point change in the probability of ever attending 10<sup>th</sup> grade. Considering that only 8 percent of all Ethiopian students do not make it to 10<sup>th</sup> grade (Table 1), a 1.5 percentage point response is quite substantial in magnitude, in addition to being statistically significant.

Although Table 4 reports results from many different probits, several patterns emerge in the analysis. First, the average standardized math score appears to be significant at the 10 percent level for three of the eight high school outcomes, and marginally insignificant for two additional outcomes. The results are similar (but a little weaker) using the average percentile math score. The outcomes that emerge significant are primarily those about staying in school and progressing through the system without repeating grades. Somewhat surprisingly, math scores do not seem to be related to the key outcome of passing the matriculation exams, even though math quality does reduce the dropout rate, which is also a very important outcome.

The last two columns of Table 4 use verbal scores as the measure of school quality. In contrast to the results using math scores, verbal scores of the elementary school are significant determinants of only two of the high school outcomes, most notably the overall dropout rate, and some of the coefficients have the wrong sign. The results are similar using the average standardized verbal scores or the average percentile score. Although Table 4 presents some evidence that the verbal quality of the elementary school affected the dropout rates of Ethiopian children in high school, the results for verbal scores are clearly much less consistent across outcomes than the results for math scores. This pattern will repeat itself, and therefore, will be

discussed at length later on. In the meantime, the mixed results for verbal scores should be interpreted with caution.

# 2. Allowing for a non-linear effect of school quality

Tables 4 examined whether the math and verbal quality of the elementary school is related to various high school outcomes with a linear specification. We now examine whether the effect of school quality is non-linear. Theoretically, students may benefit by being in only the top schools, or perhaps student's performance is negatively affected only if they attend the worst schools. Another possibility could be that Ethiopian students benefit from good schools, but not from the very best schools because the distance between them and the other students is too great, and perhaps detrimental to the morale and learning process of Ethiopian immigrants. Some evidence for this scenario is presented in Figures 4a-4d, which show how the various high school outcomes of Ethiopian students vary according to the average math percentile rank of their elementary school. For a variety of outcome variables, the figures present both the average success rates in each quintile of the distribution of elementary school math scores, and a kernel estimate of the success probability on the average percentile math score.<sup>24</sup>

For all of the outcomes in Figures 4a-4d, the effect of math scores is linear for much of the graph, but is often interrupted by an abrupt jump or dip at one or both tails of the distribution. For example, the probability of ever attending 10<sup>th</sup> grade (Figure 4a) is lowest in the lowest quality schools, then appears to be flat in the middle of the distribution, and then jumps up abruptly in the top quintile. The probability of reaching 12<sup>th</sup> grade rises almost linearly, and then dips in the top quintile (Figure 4b). The dropout rate in Figure 4c exhibits no meaningful trend in the bottom half of the distribution, until sharply dipping in the upper tail.

The non-linear pattern is more dramatic for the high school matriculation outcomes in Figure 4d. Ethiopians do better in the worst schools than the second worst, but then they seem to benefit from the higher math quality of the school until the abrupt dip in the upper quintile. The effect of math quality is linear in the middle quintiles, but the interruptions at the tails of the distribution cause the coefficient in a linear specification (Table 4) to be insignificant. There are two possible interpretations for these patterns. First, the effect is indeed non-linear. Second, the

 $\hat{f}(x_0) = \frac{\frac{1}{\lambda T} \sum_{t=1}^{T} K\left(\frac{x_t - x_0}{\lambda}\right) y_t}{\frac{1}{\lambda T} \sum_{t=1}^{T} K\left(\frac{x_t - x_0}{\lambda}\right)}.$ 

We used a biweight kernel,  $K(u)=(15/8)(1-4u^2)^2$  for  $u \in [-\frac{1}{2},\frac{1}{2}]$ , and bandwidth  $\lambda=0.28$ .

<sup>&</sup>lt;sup>24</sup> The kernel estimate of the regression function at  $x_0$  is

data is noisy due to the small sample size (509 observations). Both of these interpretations are examined in Tables 5a and 5b.

Table 5a tests for a non-linear relationship between high school outcomes and two different ways of creating a non-linear math score. First, we simply create five dummy variables for whether the school's average percentile score falls within the five quintiles of the national distribution of average math scores (as displayed in Figures 4a-4d). Secondly, we calculate the national quartile of the school's 4<sup>th</sup> and 5<sup>th</sup> grade scores separately, and assign a value of 1 to a school that falls in the first (bottom) quartile, a value of 2 to a school that falls in the second quartile, and so on. We then add the values for 4<sup>th</sup> and 5<sup>th</sup> grade scores, and call the resulting sum the "quartile score". Therefore, a school that ranks in the third quartile of 4<sup>th</sup> grade scores and in the fourth (top) quartile of 5<sup>th</sup> grade scores will have a "quartile score" of 7. The non-linear specification will then include dummy variables for each possible quartile score between 2 and 8 (with one category obviously omitted). The reasons for creating the "quartile score" are to check the robustness of using the quintiles of the average percentile scores, and to smooth out idiosyncrasies in the average percentile score of any given school by grouping the 4<sup>th</sup> and 5<sup>th</sup> grade scores first into quartiles before combining them.

The coefficients in columns (1) of Table 5 essentially test for whether the patterns seen in Figures 4a-4d are statistically significant. Overall, the results confirm what the pictures show: the upper two quintiles are often significant, although the top quintile seems somewhat weaker than the second highest quintile. This result may be due to the small number of students<sup>25</sup> in the top quintile, or as mentioned above, perhaps the gap between immigrants and natives was so large in the very best schools that Ethiopian students ended up suffering because of it. It is important to note that the omitted category is the bottom quintile, which sometimes is more beneficial to Ethiopian students than being in the second quintile – this is particularly true for passing the matriculation exams. If the second quintile (Q2) were the excluded category in the matriculation exam regression, the coefficients for the other groups would obviously be more significant.

As stated above, the small sample sizes could be contributing to the changes in patterns at the tails of the math distribution, so we investigate this further by dividing schools into "good" and "bad" schools based on their average percentile rank. Column (2) in Table 5a groups the upper two quintiles together and this measure comes in quite significant for 6 of the 8 high school outcomes, including the most important ones: the dropout rate and the passing rate on the matriculation exams.

The analysis is repeated using our second non-linear measure of math scores, the "quartile score", in columns (3) and (4) in Table 5a. The results are very similar to those obtained with the

quintiles for the average percentile: the better math schools significantly impact high school outcomes, but the impact seems to be greater for the "good" schools (schools with a quartile score of 6 or 7) than for the "best" schools (schools with a quartile score of 8). However, when the upper schools are grouped together in column (4), the effect of the better schools is much more pronounced for all of the high school outcomes.

Overall, Table 5a shows that the effect of math quality of the elementary school on high school outcomes appears to be non-linear. The strongest results are when we divide the schools into two categories, which could be interpreted as proxying for "good" versus "bad" schools where students seem to significantly benefit from being placed in "good" elementary schools. However, the results might be sharper using this dichotomous variable simply because it reduces the amount of noise in the data stemming from a rather small sample size and noisy measures of school quality.

Table 5b repeats the non-linear analysis with the verbal scores instead of the math scores. The results here are similar to those in Table 4 where verbal scores were not significantly related to most of the high school outcomes. Even using the dichotomous measures of "good" and "bad" schools does not affect these results, as none of the coefficients emerge statistically significant for any high school outcome. The verbal quality of the elementary school seemingly has had no impact on the high school outcomes of Ethiopian immigrants, and this begs for an explanation.

#### 3. Reconciling the differences between math and verbal scores as measures of school quality

To investigate why the verbal and math results differ, we checked for whether the relationship between high school outcomes and the two different types of tests is also different for other Israeli students, or whether this phenomenon is unique to the Ethiopian sample. The first two columns of Table 6 replicate the column 2 of Tables 5a and 5b for the sample of other Israeli 5<sup>th</sup> graders in 1993/94 (the sample, shown in column 4 in Table 1, includes Israeli Jews but excludes former Soviet Union and older Ethiopian immigrants). For every high school outcome in Table 6, the math and verbal score coefficients are nearly identical to each other in magnitude and statistical significance. Although these coefficients should not be interpreted as being causal, since we do not claim that other Israelis were randomly distributed into elementary schools, these results show that there are no differences in the relationship between math and verbal scores with the high school outcomes for other Israelis. These findings suggest that the differential effects of math and verbal scores of the elementary school on the high school outcomes of Ethiopian students are most likely particular to the case of the Ethiopians themselves, rather than something systematic about the two tests which should also show up for other Israelis.

<sup>&</sup>lt;sup>25</sup> Forty-three students (8.5 percent of the sample) were in the top quintile of elementary schools. 124 students were

In light of these findings, we have encountered ample anecdotal evidence that could help explain why the quality of the verbal program in the elementary school may not have been as relevant for Ethiopian students as the math program. First, in many elementary schools, Ethiopian students were taught Hebrew in special classes separate from the other Israeli children. Second, when the Ethiopian students were taught in separate classes, often their teachers were recent high school graduates performing national service, which would render the verbal quality of the regular program inconsequential for Ethiopians. Third, a weak or even a strong verbal program may have been diluted by "after-school" programs aimed at teaching language skills to Ethiopian immigrant children. There is evidence that such programs were indeed offered to the May 1991 immigrant pupils in their schools and at the community level. Finally, it may be the case that Ethiopian students benefited more from a strong math program because their language deficit was less of a problem in learning math skills. All of these factors combined may be the reason why the math and verbal quality of the elementary school is so differentially related to high school outcomes for Ethiopians, but not for other Israeli students.

# 4. Summarizing the linear and non-linear results

Overall, the linear and non-linear results show that the elementary school environment, as measured by the math performance of students prior to the Ethiopian immigration, has positively affected the chances of Ethiopian students to proceed through high school without repeating a grade or dropping out. The non-linear specification also shows that Ethiopians who attended "good schools" had significantly higher passing rates on the matriculation exams. All of these findings suggest that Ethiopians who were randomly placed into better elementary schools had a better chance to succeed in high school, thus validating the importance of the early schooling environment.

One may suspect that elementary school math scores are correlated with other aspects of the elementary school environment, and perhaps are picking up the causal effect of these omitted characteristics, rather than the direct effect of school quality. For example, it may be the case that Ethiopian children surrounded by high quality peers were more likely to patronize the public library, participate in extracurricular activities, or simply were more motivated to succeed in school. Alternatively, favorable labor market opportunities faced by the parents may also have contributed to the children's schoolstic achievements. In these examples, it is not elementary school quality in and of itself (the quality of the educational program, the organizational

in the bottom quintile, 185 in the second quintile, 94 in the third quintile and 63 in the fourth quintile.

<sup>&</sup>lt;sup>26</sup> In footnote 12 we presented quotes of Ministry of Education officials that indicated that the official policy contemplated language instruction in separate classes.

<sup>&</sup>lt;sup>27</sup> The national service of teaching in religious elementary schools is an option opened only to religious female high school graduates as an alternative to their compulsory military service.

capabilities of headmasters, the motivational abilities of teachers) that affects high school outcomes: instead, an Ethiopian child placed in a good "environment" (high quality peers, availability of extracurricular activities, good labor market prospects for the parents) would be more likely to succeed, even if she attended a low quality school.

These hypotheses cannot be ruled out at this stage, but it does not change the basic finding that the elementary school environment matters for high school success. In addition, if these hypotheses were correct, the unobserved variable is also likely to be correlated with the verbal quality of the elementary school, but we do not find any effects for the verbal scores. In this sense, the differences between the verbal and math score results increase the likelihood that we have identified the effect of being in an elementary school with a strong math program, or at least something correlated with the math program and not the verbal program.

In the next section, we add several more variables of the schooling environment in order to isolate whether the math quality of the elementary school is indeed the determining factor. But, the lesson so far is that the early schooling environment matters, even for the important outcomes like dropout rates and passing rates on the matriculation exams.

## VI. Adding additional controls for the schooling environment

Table 7a tests the robustness of the results presented in Table 5a by seeing how sensitive the "Top 2 Quintile" dummy variable for math scores (column 2) is to the inclusion of additional controls for the schooling environment. Table 7b repeats the analysis for our second measure of "good schools" by using the "high quartile score" dummy variable (column 4). We do not present regressions testing the sensitivity of the verbal score results, since the verbal results were never significant and they stay insignificant with all of the additional controls.

Column (1) in Table 7a adds the socioeconomic index of the students in the elementary school (measured a year prior to the arrival of the Ethiopian immigrants) in the regression. Comparing these results to those in column 2 of Table 5a, the coefficients are nearly identical in magnitude and significance, thus demonstrating that the significance of a good math program is not stemming from a correlation with the quality of the students in the school. Furthermore, the inclusion of the socioeconomic index indicates that the quality of the school itself (teachers, headmasters, facilities), rather than the students in the school, is affecting the outcomes of Ethiopian children.

In second column of Table 7a, the percentage of Ethiopian students in the classroom is added to the specification in column (1). If high quality schools absorbed fewer Ethiopian immigrants than low quality schools, the estimates in the previous section may be picking up the effect of being in a class or a school with a low number of Ethiopian pupils, rather than the

quality of instruction. Column (2) tests this hypothesis by including the percent of Ethiopian students in the class, and the results are virtually unchanged in magnitude or precision.<sup>28</sup>

The third column of Table 7a includes several characteristics describing the community population surrounding the school (income per capita, matriculation rate, welfare recipients per 1000 inhabitants, rate of unemployment benefit recipients, and the dependency ratio). All these measures were taken from 1991, a year prior to the immigration wave, in order to avoid being endogenous to the presence of Ethiopian children and families in the school or school district. After including these additional characteristics of the other students and population within the schooling district, the coefficient on elementary school math scores should isolate the effect of school quality (the quality of teachers, the quality of headmasters, school resources, etc.) rather than the effect of higher quality peers or favorable economic opportunities for the parents. <sup>29</sup>

After including these variables, almost all the coefficient estimates for being in a "good" math school are virtually unchanged in magnitude, but there is some loss of precision, which is expected since these variables are all highly correlated with each other and with the math score variable. The coefficient is still statistically significant at the 10 percent level for ever attending 10<sup>th</sup> grade, reaching 11<sup>th</sup> grade without repetition and, perhaps most importantly, dropout rate and the matriculation exam passing rate.

The only coefficient that changes significantly in magnitude with these additional controls is "quality of high school attended", and this finding leads to two conclusions. First, the local schooling characteristics, and not the math program of the elementary school, affect the quality of the high school that the students eventually attend. Second, because the local schooling characteristics do not affect the coefficient for math scores on individual high school outcomes like dropout rates, we can infer that school quality affects dropout rates directly, and not by affecting the quality of the high school attended.

The robustness of almost all of the coefficients to the inclusion of these community variables contrasts sharply with what we see using other Israelis. Back in Table 6, the relationship between the high math score variable and all of the high school variables is very sensitive to the inclusion of these additional controls. After including these controls for other Israelis in Table 6 (columns 3 and 4), all of the estimated coefficients are halved, and this pattern

<sup>&</sup>lt;sup>28</sup> Instead of the percent of Ethiopians in the class, we have experimented with the percent of Ethiopians in the grade, in the school, and also by including Ethiopians from the previous wave of immigration. In addition, we tried the number of Ethiopian students instead of the percentage. None of these variables affected the coefficient on the math score variable.

<sup>&</sup>lt;sup>29</sup> After controlling for the additional variables, the effect of average math scores isolates the effect of math scores on high school outcomes, which cannot be explained by the socioeconomic background of the students, poverty rate, etc. This is similar to including the "residual average math score" after regressing average math score on the other school and district characteristics. The data actually show that Ethiopians attended schools with relatively high "residual average math" scores, which means that although they typically went to school in poorer areas, they tended to be in schools with high math scores given the background of their student population.

repeats itself for both the math and verbal score regressions. These results show that native Israelis, in contrast with the Ethiopian immigrants, were sorted in a non-random fashion across schools. Without the community controls, the coefficient on high math scores for native Israelis picks up the effect of unobservable background variables on high school outcomes. Once additional background variables are included, this omitted variable bias diminishes, but we cannot tell whether it disappears completely. Our findings that the coefficients for Ethiopians were not sensitive to these controls highlights just how different the allocation of Ethiopians differs from native Israelis, and strengthens the causal interpretation of the estimated impact of the elementary school quality on high school outcomes of Ethiopian pupils.

The fourth column of Table 7a adds a dummy variable for whether the Ethiopian student lived in a caravan site during fifth grade. The rationale for including this variable is that caravan sites (temporary housing sites) were often set-up far from established schools, so that the characteristics of the community environment variables (used in the third column), and perhaps the schooling environment itself, may be less relevant for these students. Again, the results are not affected very much by adding this control in terms of the magnitude of the coefficients, but there is a little erosion in significance.

The final column of Table 7a adds fixed-effects for the neighborhood of residence to the analysis. This column represents the ideal experiment we would want to conduct in order to isolate the effect of school quality from the other neighborhood and community variables.<sup>30</sup> Ideally, we would want to take kids from the same neighborhood and send them to different schools of varying quality in order to isolate the effect of the school. Fortunately, the Ethiopian immigration process did just that in many neighborhoods, so when we include neighborhood fixed-effects, we exploit variation in school quality within the same neighborhood to explain high school outcomes. The cost of including these fixed-effects is that we lose a significant amount of degrees of freedom because of the inclusion of 61 new variables, and we effectively lose observations where all the children from the same neighborhood were sent to the same school.

The results with fixed-effects are presented in the fifth column of Table 7a. Overall, the magnitude of the coefficients does not change drastically, but the significance is weakened, most

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<sup>&</sup>lt;sup>30</sup> This is the ideal experiment under the assumption that, given the locality of residence, the quality of the school one attends is exogenous to the individual's background characteristics. We have argued that Operation Solomon essentially randomly assigned immigrants across localities, but one cannot rule out the possibility that educated parents were able to choose the good schools within the locality of residence, invalidating our identification strategy. However, it seems unlikely that even the educated Ethiopian parents were sufficiently sophisticated and knowledgeable of the Israeli school system only two years after their immigration to be able to select high quality schools for their children. This is confirmed by running a regression of elementary school quality on parental education (as in Tables 2 and 3) and a full set of locality of residence fixed effects. The t-statistic on father's education are 1.19 and 0.32 in the math quality and verbal quality regressions respectively, and the t-statistics on mother's education are 0.11 and -0.27. All the t-statistics are well below critical significance levels, indicating that there is no correlation between parental education and school quality *within* localities, as well as between localities.

likely due to the reduced degrees of freedom. The passing rate on the matriculation exams remains significant, but several other outcomes are no longer significant. However, due to the small sample sizes, we expected that we could not identify these effects with strong precision. The fact that the results look very similar in magnitude to Table 5a suggests that school quality is likely to be an important factor, but for some of the outcomes we cannot reject the hypothesis that the significant effect of the schooling environment seen in Table 5a might be due to other neighborhood characteristics rather than the school itself.

Table 7b repeats the sensitivity analysis in Table 7a, but uses the math "quartile score dummy" as a proxy for school quality instead of the "high quintile" for math. The coefficients in Table 7b, therefore, should be compared to those without additional controls in the last column of Table 5b. As additional control variables are added, the pattern of results is very similar to the pattern in Table 7a. That is, the coefficients on math quality are not highly sensitive in magnitude or precision to the additional controls for the socioeconomic index of students, percent Ethiopians in the class, a dummy for living in a caravan site, school community characteristics (income per capita, unemployment rate, etc.) Overall, these results confirm the importance of a strong math program in elementary school for Ethiopian immigrants, although other characteristics of the schooling environment may be playing a limited role.

## VII. How Large Is the Effect of School Quality?

In our main analysis, the coefficients estimates for the two "high" math score dummy variables on matriculation passing rates range from 0.071 to 0.082 in Table 5a, and 0.074 to 0.122 in Tables 7a –7b. To illustrate the size of these coefficients, we predict and compare the outcomes for a student with average characteristics placed in a low or high quality elementary school. Table 8 presents these predictions for two important outcomes: the probability of reaching 12<sup>th</sup> grade without repetition and the probability of passing the high school matriculation exams.<sup>31</sup>

The first two columns in Table 8 predict the outcomes for a representative new Ethiopian immigrant pupil. The first column predicts the outcome when this representative pupil is placed in a low quality school and the second column is for when he is placed in a high quality school. The probability of reaching 12th grade without repetition is increased from 64.3 to 77.0 percent, a 20 percent improvement as a result of increasing school quality from low to high. The probability of passing the high school matriculation exams is increased from 26.0 to 34.4 percent, a 32 percent improvement as a result of increasing school quality from low to high. These are large

<sup>&</sup>lt;sup>31</sup> The prediction is based on the model that includes as additional controls the school's socioeconomic index, the percentage Ethiopians in class, and the school locality characteristics (i.e., column (3) of Tables 7a and 7b). High quality schools were defined to be schools with a math quartile score greater than 6.

effects, even dramatic in the case of affecting the probability of obtaining a matriculation diploma.

We can also gauge the relative size of the "school quality" effect by assessing how much of the gap in high school outcomes between Ethiopian and native children can be closed by simply moving an Ethiopian child from a low to high quality school. We perform these calculations for three native comparison groups: 1) "Other Israeli" students (i.e., Jewish students excluding Ethiopian and former Soviet Union immigrants) whose father had less than eight years of schooling. 2) Other Israeli students who were in the same elementary school as the May 1991 Ethiopians. 3) Other Israeli students who were in the same high school as the May 1991 Ethiopians. The mean outcomes used for comparison are presented for these three groups in columns 3-5 of Table 8.

The gap in the average probability of reaching 12<sup>th</sup> grade without repetition between Ethiopians with average characteristics in low quality elementary schools and each of the three comparison groups is 18.0, 22.4, and 27.7 percentage points respectively. If all Ethiopians were to be placed into high quality elementary schools, the gaps relative to the three comparison groups are reduced dramatically to 5.3, 9.7 and 15.0 points respectively. Most dramatic is the almost total elimination of the gap relative to the group of Israeli pupils who is closest to the Ethiopian pupils in terms of family educational background.

The gap in the average probability of passing the high school matriculation exams between Ethiopians with average characteristics in low quality schools and each of three comparison groups is 14.7, 16.7 and 31.3 percentage points respectively. If all Ethiopians were placed in high quality elementary schools these gaps would be reduced significantly to 6.4, 18.4, and 23.0 percentage points respectively. Again, most dramatic is the closing of more than a half of the gap relative to the group of Israeli pupils who had similar family educational background.

#### VIII. Conclusion

The analysis in this paper exploits the exogenous variation of school quality created by the random assortment of Ethiopian immigrant children into schools upon their arrival. This natural experiment created a unique research opportunity to study the effects of the elementary schooling environment on high school outcomes.

The results suggest that elementary schools that are strong in math have a significant impact on the dropout rates of students in high school, with some evidence that they also impact the passing rate on high school matriculation exams, which are necessary to enter college. At the minimum, these results point to the importance of the early schooling environment in determining important high school outcomes such as dropout rates and passing the matriculation exams. However, we also tried to isolate the effect of the quality of the math program itself by

incorporating several additional controls for the early schooling environment, which capture the quality of the students and parents at the school and community level. After controlling for these additional variables, the math program of the elementary school still appears to be a strong factor affecting dropout rates, and our nonlinear specification suggests that students in high quality elementary schools versus low quality elementary schools have higher passing rates on their matriculation exams.

In contrast to the math quality of the elementary school, we find little or no evidence that attending an elementary school with high verbal performance affects outcomes in high school. We suspect that this result is due to several factors that rendered the strength of verbal program in school less relevant for Ethiopian students.

We believe that these results can have important and far-reaching implications, which go well beyond the immediate but narrow Israeli context. First, this paper is one of the first attempts at estimating precisely the effect of school quality in a setting that resembles as closely as possible the ideal conditions of a controlled laboratory experiment. Second, all industrialized countries have seen a sharp increase in immigration rates from the developing world in the past two decades. The question of how to successfully integrate younger generations of immigrants, first in the school system, and subsequently in the fabric of society, is at the forefront of policymakers' agendas throughout the Western world. Third, substantial gaps in educational achievements exist even among natives of different ethnic or racial background. The gap in educational achievements between blacks and whites in the United States is quite similar to the gap between Ethiopians and native Israelis. The results in this paper suggest that a substantial fraction of the gap could be closed if minority students attended higher quality elementary schools. Finally, our results can also be placed in the context of the developing world, and Africa in particular. The mean high school outcomes of the new Ethiopians in Israel, especially of those who were placed in good elementary schools, should strengthen the quest for improving schooling quality in poor countries in their strive for economic and social development.

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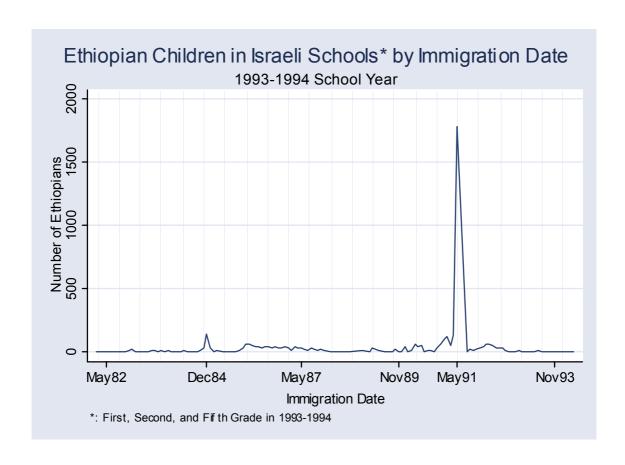


Figure 1: Ethiopian Children in Israeli Schools by Immigration Date

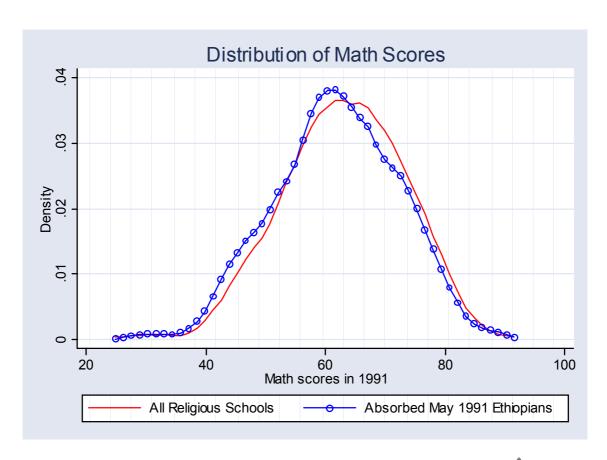


Figure 2: School Quality of Absorbing Schools versus All Schools\*

<sup>\*</sup> Kernel density estimates of average math scores in 1991 in all schools and in schools that absorbed Ethiopian immigrant children who arrived in May 1991. Religious schools only. The total number of religious schools is 305. The number of religious schools that absorbed Ethiopians is 121.

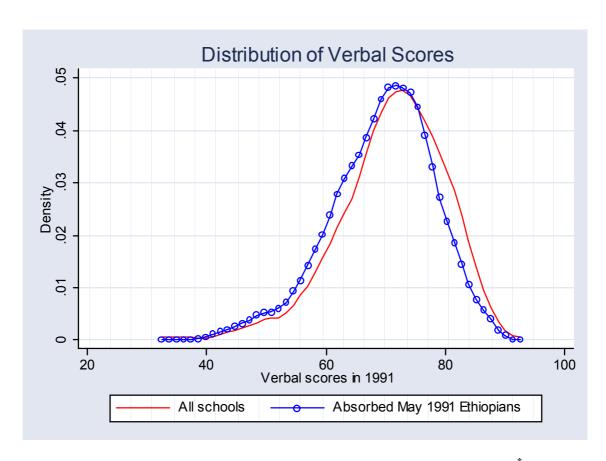


Figure 3: School Quality of Absorbing Schools versus All Schools\*

<sup>\*</sup> Kernel density estimates of average verbal scores in 1991 in all schools and in schools that absorbed Ethiopian immigrant children who arrived in May 1991. Religious schools only. The total number of religious schools is 305. The number of religious schools that absorbed Ethiopians is 121.

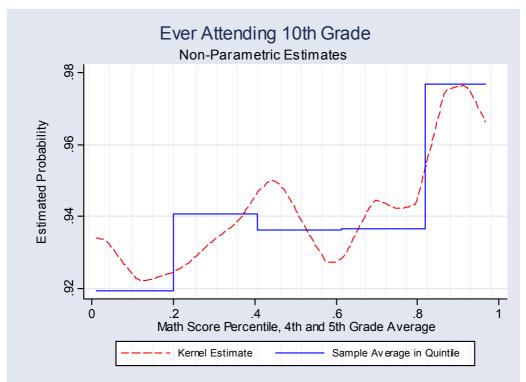


Figure 4a: Elementary School Quality and Ever Attending 10<sup>th</sup> Grade\*

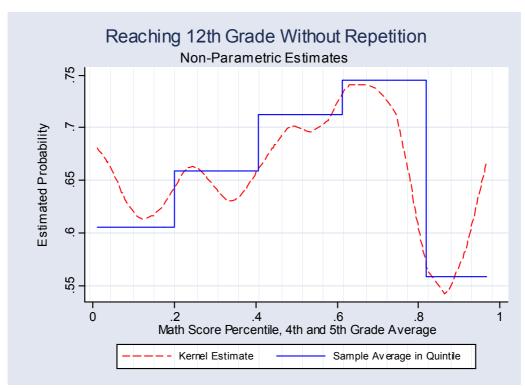


Figure 4b: Elementary School Quality and Progressing Through High School Without Repetition\*

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<sup>\*</sup> The graphs represent non-parametric estimates of the relationship between the outcome variable and the average percentile of math test scores in 4<sup>th</sup> and 5<sup>th</sup> grade. The kernel estimate uses a biweight kernel and a bandwidth of 0.28.

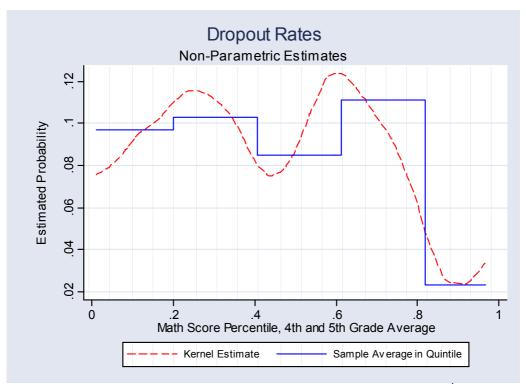


Figure 4c: Elementary School Quality and Dropout Rates\*

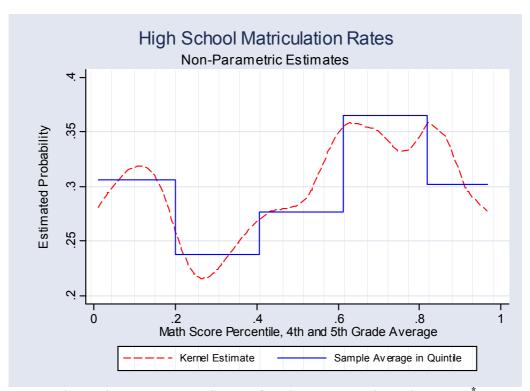


Figure 4d: Elementary School Quality and Matriculation Rates

<sup>\*</sup> The graphs represent non-parametric estimates of the relationship between the outcome variable and the average percentile of math test scores in 4<sup>th</sup> and 5<sup>th</sup> grade. The kernel estimate uses a biweight kernel and a bandwidth of 0.28.

	Table 1. St	ımmary Statistic	3	
	Ethiopians, Immigrated May 1991	Ethiopians, Immigrated in 1980s	Former Soviet Union Immigrants	Other Jews <sup>a</sup>
Number of Students	532	536	5762	55891
Elementary School Character	istics			
Average Math Score in 1991, 4 <sup>th</sup>	64.42	60.62	67.52	69.60
Grade	(9.47)	(8.76)	(8.26)	(7.53)
Average Math Score in 1991, 5 <sup>th</sup>	63.04	60.35	65.93	68.19
Grade	(9.68)	(9.50)	(9.05)	(8.49)
Average Verbal Score in 1991, 4 <sup>th</sup>	67.85	64.55	70.80	73.03
Grade	(7.87)	(8.54)	(7.59)	(6.85)
Average Verbal Score in 1991, 5 <sup>th</sup>	70.38	68.48	72.97	75.02
Grade	(7.52)	(7.55)	(7.35)	(6.60)
1991 Socioeconomic Index <sup>b</sup>	-1.12	-1.35	0.05	0.20
	(1.06)	(1.29)	(0.82)	(0.81)
Religious School	0.92	0.86	0.15	0.22
8	(.27)	(0.34)	(0.36)	(0.42)
% Ethiopians in Class	0.32	0.24	0.015	0.017
70 Editopians in Class	(0.28)	(0.16)	(0.056)	(0.057)
% Ethiopians in Grade	0.27	0.23	0.015	0.018
70 Ethiopians in Grade	(0.21)	(0.16)	(0.052)	(0.058)
Father's Years of Schooling	1.67 (3.24)	2.99 (4.10)	11.43 (5.46)	11.58 (4.27)
Mother's Years of Schooling	1.27	2.56	12.27	11.70
	(2.82)	(3.81)	(4.65)	(4.00)
Number of Siblings	4.12	4.21	1.10	2.38
	(2.60)	(2.25)	(1.17)	
Age in 1994		( )	(1.17)	(1.55)
	11.5	11.43	11.43	(1.55) 11.14
	11.5 (1.23)	` /		
High School Outcome Variabl	(1.23)	11.43	11.43	11.14
	(1.23) es	11.43 (0.60)	11.43 (0.68)	11.14 (0.39)
	(1.23) les 0.92	0.91	11.43 (0.68)	0.96
Ever Attended 10 <sup>th</sup> Grade	(1.23) les 0.92 (0.26)	0.91 (0.28)	0.86 (0.35)	0.96 (0.20)
Ever Attended 10 <sup>th</sup> Grade	(1.23) les 0.92 (0.26) 0.86	0.91 (0.28) 0.87	0.86 (0.35) 0.82	0.96 (0.20) 0.94
Ever Attended 10 <sup>th</sup> Grade Ever Attended 11 <sup>th</sup> Grade	(1.23)  les  0.92 (0.26) 0.86 (0.34)	0.91 (0.28) 0.87 (0.33)	0.86 (0.35) 0.82 (0.39)	0.96 (0.20)
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without	(1.23)  (es	0.91 (0.28) 0.87 (0.33) 0.86	0.86 (0.35) 0.82 (0.39) 0.80	0.96 (0.20) 0.94 (0.24) 0.94
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without  Repetition	(1.23)  les  0.92 (0.26) 0.86 (0.34) 0.67 (0.47)	0.91 (0.28) 0.87 (0.33) 0.86 (0.35)	0.86 (0.35) 0.82 (0.39) 0.80 (0.40)	0.96 (0.20) 0.94 (0.24) 0.94 (0.24)
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without  Repetition  Reached 11 <sup>th</sup> Grade Without	(1.23)  (es)  (0.26) (0.86) (0.34) (0.67) (0.47) (0.67)	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without  Repetition  Reached 11 <sup>th</sup> Grade Without  Repetition	(1.23)  (es)  0.92 (0.26) 0.86 (0.34) 0.67 (0.47) 0.67 (0.47)	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39)	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42)	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27)
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without  Repetition  Reached 11 <sup>th</sup> Grade Without  Repetition  Reached 12 <sup>th</sup> Grade Without	(1.23)  les  0.92 (0.26) 0.86 (0.34) 0.67 (0.47) 0.67 (0.47) 0.65	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39) 0.78	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42) 0.74	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27) 0.89
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without  Repetition  Reached 11 <sup>th</sup> Grade Without  Repetition  Reached 12 <sup>th</sup> Grade Without  Repetition  Reached 12 <sup>th</sup> Grade Without  Repetition	(1.23)  les  0.92 (0.26) 0.86 (0.34) 0.67 (0.47) 0.67 (0.47) 0.65 (0.48)	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39) 0.78 (0.41)	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42) 0.74 (0.44)	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27) 0.89 (0.31)
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without Repetition  Reached 11 <sup>th</sup> Grade Without Repetition  Reached 12 <sup>th</sup> Grade Without Repetition  Reached 12 <sup>th</sup> Grade Without Repetition  Dropped Out Before Completing	(1.23)  les  0.92 (0.26) 0.86 (0.34) 0.67 (0.47) 0.67 (0.47) 0.65 (0.48) 0.10	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39) 0.78 (0.41)	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42) 0.74 (0.44) 0.22	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27) 0.89 (0.31) 0.09
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without Repetition  Reached 11 <sup>th</sup> Grade Without Repetition  Reached 12 <sup>th</sup> Grade Without Repetition  Dropped Out Before Completing 12 <sup>th</sup> Grade	(1.23)  (1.24) (1.24) (1.24) (1.24) (1.24) (1.25) (1.26) (1.26) (1.27) (1	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39) 0.78 (0.41) 0.17 (0.38)	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42) 0.74 (0.44) 0.22 (0.41)	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27) 0.89 (0.31) 0.09 (0.27)
Ever Attended 10 <sup>th</sup> Grade  Ever Attended 11 <sup>th</sup> Grade  Reached 10 <sup>th</sup> Grade Without Repetition  Reached 11 <sup>th</sup> Grade Without Repetition  Reached 12 <sup>th</sup> Grade Without Repetition  Dropped Out Before Completing 12 <sup>th</sup> Grade  Passing High School	(1.23)  les  0.92 (0.26) 0.86 (0.34) 0.67 (0.47) 0.67 (0.47) 0.65 (0.48) 0.10 (0.30) 0.23	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39) 0.78 (0.41) 0.17 (0.38) 0.29	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42) 0.74 (0.44) 0.22 (0.41)	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27) 0.89 (0.31) 0.09 (0.27) 0.58
Reached 11 <sup>th</sup> Grade Without Repetition Reached 12 <sup>th</sup> Grade Without Repetition Dropped Out Before Completing	(1.23)  (1.24) (1.24) (1.24) (1.24) (1.24) (1.25) (1.26) (1.26) (1.27) (1	0.91 (0.28) 0.87 (0.33) 0.86 (0.35) 0.82 (0.39) 0.78 (0.41) 0.17 (0.38)	0.86 (0.35) 0.82 (0.39) 0.80 (0.40) 0.77 (0.42) 0.74 (0.44) 0.22 (0.41)	0.96 (0.20) 0.94 (0.24) 0.94 (0.24) 0.92 (0.27) 0.89 (0.31) 0.09 (0.27)

**Notes:** Standard deviations in parentheses.

a: Other Jews: Native Israelis not of Ethiopian origin, and immigrants from anywhere except Ethiopia and the Soviet Union.

b: Standardized to have mean 0 and standard deviation 1 in the entire population of schools.

For Ethiopians who immigrated in 1991, data on matriculation rates includes the 2001-2002 school year. For all others, data includes the 2000d: Measured by the average matriculation rate between 1996 and 1998 in the high school attended.

Table 2: Test of Balancing – Ethiopians who Arrived in May 1991

Elementary School Quality Measures	Father's Years of Schooling	Mother's Years of Schooling	Male	Number of Siblings	Age in 1994
Average Math Score in 1991 <sup>a</sup>	0.005	-0.006	0.062	-0.050	0.004
	(0.39)	(-0.36)	(0.74)	(-2.42)	(0.07)
Average Verbal Score in 1991 <sup>a</sup>	0.006	0.001	0.071	-0.018	0.031
	(0.56)	(0.09)	(0.91)	(-0.93)	(0.77)
1991 Socioeconomic	0.022	0.061	0.083	-0.017	0.063
Index <sup>b</sup>	(1.58)	(3.44)	(0.79)	(-0.67)	(1.00)
Income per Capita, 1991	-1.676	-0.274	6.380	-8.570	8.690
	(-0.84)	(-0.11)	(0.46)	(-2.15)	(1.14)
Average Matriculation	0.098	0.140	0.412	-0.055	0.232
Rates, 1992/93	(0.81)	(0.73)	(0.43)	(-0.18)	(0.37)
Welfare Recipients,	0.013	0.008	0.303	-0.031	0.017
1991 <sup>b,c</sup>	(1.06)	(0.63)	(0.38)	(-1.51)	(0.37)
UI Recipients,	0.0021	0.003	0.007	-0.001	0.009
1991 <sup>b,c</sup>	(1.60)	(1.88)	(0.83)	(-0.47)	(0.23)
Dependency Ratio,	0.007	-0.006	-0.047	-0.034	0.005
1991 <sup>a,b</sup>	(0.53)	(-0.24)	(-0.56)	(-1.21)	(0.08)

Notes: The entries in the table represent the coefficients from separate univariate regressions of the school and locality characteristics variables on the background characteristics. Robust t-statistics (adjusted for clustering) in parentheses.

<sup>&</sup>lt;sup>a</sup>: The average math and verbal scores are the averages of the standardized scores for 4<sup>th</sup> and 5<sup>th</sup> grade students in 1991.

b: Standardized to have mean 0 and standard deviation 1.

c: Transformed so that high values of the variable represent good outcomes: low welfare recipiency rates, low unemployment, low dependency ratios.

Table 3 – Tests for Balancing, Other Groups

0.005 (0.39) -0.006 (-0.36)	0.027 (2.28) 0.035 (2.55)	0.012 (3.90) 0.021 (4.38)	0.033 (12.73) 0.035 (11.96)
-0.006 (-0.36)	0.035	(3.90)	(12.73) 0.035
-0.006 (-0.36)	0.035	0.021	0.035
(-0.36)			
	(2.55)	(4.38)	(11.96)
Avorago Vorbel			
Average verbai	Score in Elementa	ry School, 1991	
0.006	0.027	0.013	0.042
(0.56)	(2.32)	(4.25)	(17.53)
0.001	0.037	0.021	0.044
(0.09)	(2.66)	(4.12)	(15.95)
e Matriculation	Rate at High School	ol Attended, 1996-19	998
0.010	0.007	0.006	0.013
(3.36)	(2.35)	(7.22)	(22.33)
0.009	0.008	0.007	0.013
(2.51)	(2.60)	(6.47)	(18.19)
	0.006 (0.56) 0.001 (0.09) e Matriculation 0.010 (3.36) 0.009	0.006 (0.56) (2.32)  0.001 (0.09) (2.66)   e Matriculation Rate at High School (2.35)  0.010 (0.007 (2.35)  0.009 0.008	(0.56) (2.32) (4.25)  0.001 0.037 0.021 (0.09) (2.66) (4.12)   Matriculation Rate at High School Attended, 1996-19  0.010 0.007 0.006 (3.36) (2.35) (7.22)  0.009 0.008 0.007

**Notes**: The entries in the table represent the coefficients from separate univariate regressions of the average test scores on the background characteristics. The average test scores are the averages of the standardized scores for  $4^{th}$  and  $5^{th}$  grade students in 1991. Robust t-statistics (adjusted for clustering) in parentheses.

<sup>&</sup>lt;sup>a</sup>: Other Jews: Native Israelis not of Ethiopian origin, pre-1989 Soviet Union immigrants, and all other immigrants from anywhere except Ethiopia and the Soviet Union.

Table 4: The Elementary School Environment and High School Outcomes

	Math Scor	es in 1991	Verbal Scor	res in 1991
	Average	Average	Average	Average
	Standardized	Percentile,	Standardized	Percentile,
	Score, 4 <sup>th</sup> and	4 <sup>th</sup> and 5 <sup>th</sup>	Score, 4 <sup>th</sup> and	4 <sup>th</sup> and 5 <sup>th</sup>
	5 <sup>th</sup> Grade	Grade	5 <sup>th</sup> Grade	Grade
Ever Attended 10 <sup>th</sup> Grade	0.015	0.060	0.020	0.084
	(2.14)	(2.15)	(2.57)	(2.29)
Ever Attended 11 <sup>th</sup> Grade	0.010	0.067	0.011	0.066
	(0.68)	(1.12)	(0.84)	(1.13)
Reached 10 <sup>th</sup> Grade Without	0.022	0.074	-0.004	-0.050
Repetition	(0.93)	(0.75)	(-0.17)	(-0.51)
Reached 11 <sup>th</sup> Grade Without	0.042	0.145	0.010	0.021
Repetition	(1.74)	(1.46)	(0.44)	(0.21)
Reached 12 <sup>th</sup> Grade Without Repetition	0.038	0.137	0.014	0.045
	(1.61)	(1.42)	(0.63)	(0.47)
Dropped Out Before Completing 12 <sup>th</sup> Grade	-0.017	-0.076	-0.021	-0.092
	(-1.74)	(-1.98)	(-1.94)	(-1.88)
Passing High School	0.009	0.061	-0.016	-0.054
Matriculation Exams	(0.56)	(0.95)	(-0.96)	(-0.77)
Quality of High School	0.017	0.072	0.003	0.030
Attended <sup>a, b</sup>	(1.58)	(1.68)	(0.29)	(0.73)

**Notes**: The entries in the table represent the marginal effects estimated from separate probit models of the relevant outcome variable on 1991 test scores in the elementary school attended. Robust z-statistics (adjusted for clustering) for the underlying probit coefficients in parentheses. All regressions include also father's years of schooling, mother's years of schooling, a gender dummy, age in fifth grade, number of siblings (0 if unknown), a dummy for whether the number of siblings is unknown and a dummy for whether the 1994 school was religious. Sample size: 509.

<sup>&</sup>lt;sup>a</sup>: Measured by the average matriculation rate in between 1996 and 1998 in the high school attended.

<sup>&</sup>lt;sup>b</sup>: Coefficient on the 1991 test score from a linear regression model. Robust t-statistic in parenthesis. The sample includes only students who ever attended high school (451 observations).

**Table 5a: Nonlinear Effects, Math Scores** 

	(	Quintile Ra	nk of the A	verage Per	centile				Quartil	e Score		
		(:	1)		(2)		(3)					(4)
	Q2	Q3	Q4	Q5	Top 2 Quintiles	Q3	Q4	Q5	Q6	Q7	Q8	Quartile Score ≥ 6
Ever Attended 10 <sup>th</sup>	0.013	0.016	0.021	0.045	0.030	-0.001	0.003	-0.002	0.013	0.028	0.042	0.034
Grade	(0.80)	(0.77)	(1.02)	(2.74)	(1.72)	(-0.48)	(0.16)	(-0.07)	(0.50)	(1.08)	(2.36)	(2.03)
Ever Attended 11 <sup>th</sup> Grade	0.021 (0.70)	0.048 (1.24)	0.045 (1.18)	0.065 (1.14)	0.041 (1.17)	0.007 (0.19)	0.015 (0.47)	0.035 (0.80)	0.055 (1.29)	0.045 (0.83)	0.064 (1.13)	0.052 (1.57)
Reached 10 <sup>th</sup> Grade	0.083	0.073	0.148	0.010	0.040	0.099	0.023	0.099	0.159	0.175	0.023	0.067
Without Repetition	(1.21)	(0.94)	(1.79)	(0.12)	(0.70)	(1.37)	(0.30)	(1.34)	(1.70)	(1.80)	(0.28)	(1.20)
Reached 11 <sup>th</sup> Grade	0.063	0.061	0.169	0.080	0.097	0.054	-0.033	0.081	0.150	0.211	0.075	0.121
Without Repetition	(0.94)	(0.82)	(2.21)	(0.96)	(1.69)	(0.69)	(-0.47)	(1.08)	(1.74)	(2.34)	(0.87)	(2.16)
Reached 12 <sup>th</sup> Grade	0.037	0.069	0.163	0.055	0.090	0.021	-0.030	0.072	0.144	0.220	0.052	0.117
Without Repetition	(0.56)	(0.98)	(2.20)	(0.67)	(1.67)	(0.27)	(-0.43)	(0.94)	(1.73)	(2.38)	(0.61)	(2.21)
Dropped Out Before	0.007	-0.011	-0.003	-0.081	-0.040	0.048	0.004	0.018	0.014	-0.041	-0.078	-0.049
Completing 12 <sup>th</sup> Grade	(0.31)	(-0.36)	(-0.11)	(-3.59)	(-1.71)	(1.55)	(0.15)	(0.51)	(0.48)	(-0.86)	(-3.28)	(-2.15)
Passing High School	-0.079	-0.052	0.058	-0.007	0.082	-0.085	-0.075	-0.021	0.013	0.101	0.001	0.071
Matriculation Exams	(-1.82)	(-0.98)	(1.03)	(-0.11)	(2.10)	(-1.66)	(-1.57)	(-0.32)	(0.23)	(1.20)	(0.01)	(1.94)
Quality of High School	0.034	0.013	0.124	0.032	0.067	0.010	0.033	-0.020	0.101	0.087	0.025	0.062
Attended a, b	(1.03)	(0.37)	(2.82)	(0.92)	(2.33)	(0.29)	(0.75)	(-0.51)	(2.08)	(1.40)	(0.68)	(2.30)

Notes: The entries in the Table represent the marginal effects of the relevant measure of school quality on high school outcomes Robust z-statistics (adjusted for clustering) for the underlying probit coefficients in parentheses. For the full list of control variables, see the Notes to Table 4.

a: Measured by the average matriculation rate in between 1996 and 1998 in the high school attended.

b: Coefficient on the 1991 test score from a linear regression model. Robust t-statistic in parenthesis. The sample includes only students who ever attended high school (451 observations).

**Table 5b: Nonlinear Effects, Verbal Scores** 

	(	Quintile Ra	nk of the A	verage Per	centile				Quartil	e Score		
		(	1)		(2)			(.	3)			(4)
	Q2	Q3	Q4	Q5	Top 2 Quintiles	Q3	Q4	Q5	Q6	Q7	Q8	Quartile Score ≥ 6
Ever Attended 10 <sup>th</sup> Grade	0.018 (0.99)	0.031 (1.81)	0.009 (0.30)	-0.485 (-1.47)	0.016 (0.66)	0.016 (0.90)	0.025 (1.68)	0.048 (3.01)	0.025 (0.96)	0.014 (0.37)	***	0.020 (0.87)
Ever Attended 11 <sup>th</sup>	-0.029	0.012	0.025	0.044	0.040	-0.034	0.013	0.048	0.037	0.061	0.038	0.037
Grade	(-0.90)	(0.35)	(0.42)	(0.82)	(0.95)	(-0.90)	(0.40)	(1.18)	(0.68)	(0.99)	(0.70)	(0.96)
Reached 10 <sup>th</sup> Grade	-0.147	0.005	-0.113	-0.057	-0.030	-0.254	-0.099	-0.022	-0.109	-0.230	-0.066	-0.020
Without Repetition	(-2.60)	(0.09)	(-1.35)	(-0.49)	(-0.45)	(-3.37)	(-1.62)	(-0.28)	(-1.33)	(-1.33)	(-0.53)	(-0.32)
Reached 11 <sup>th</sup> Grade	-0.167	0.035	-0.100	-0.010	-0.007	-0.298	-0.094	0.020	-0.099	-0.214	-0.009	0.001
Without Repetition	(-3.23)	(0.56)	(-1.13)	(-0.11)	(-0.11)	(-4.71)	(-1.48)	(0.28)	(-1.16)	(-1.29)	(-0.09)	(0.02)
Reached 12 <sup>th</sup> Grade	-0.175	0.036	-0.085	0.001	0.008	-0.298	-0.082	0.038	-0.069	-0.194	0.016	0.018
Without Repetition	(-3.35)	(0.70)	(-0.95)	(0.01)	(0.12)	(-4.41)	(-1.36)	(0.63)	(-0.79)	(-1.23)	(0.15)	(0.28)
Dropped Out Before	-0.012	-0.021	-0.006	-0.066	-0.019	-0.020	-0.034	-0.063	-0.039	-0.027	-0.067	-0.027
Completing 12 <sup>th</sup> Grade	(-0.46)	(-0.78)	(-0.14)	(-1.58)	(-0.57)	(-0.69)	(-1.50)	(-2.53)	(-1.02)	(-0.49)	(-1.68)	(-0.85)
Passing High School	-0.048	0.001	-0.042	-0.130	-0.052	-0.046	-0.074	0.037	-0.037	-0.007	-0.198	-0.048
Matriculation Exams	(-1.14)	(0.03)	(-0.66)	(-2.01)	(-1.03)	(-0.82)	(-1.73)	(0.76)	(-0.60)	(-0.09)	(-3.25)	(-1.02)
Quality of High School	-0.051	0.006	0.001	-0.006	0.017	-0.014	-0.052	0.053	0.004	0.105	-0.019	0.019
Attended <sup>a, b</sup>	(-1.79)	(0.17)	(0.02)	(-0.14)	(0.64)	(-0.41)	(-1.73)	(1.50)	(0.14)	(3.94)	(-0.39)	(0.78)

**Notes:** The entries in the Table represent the marginal effects of the relevant measure of school quality on high school outcomes Robust z-statistics (adjusted for clustering) for the underlying probit coefficients in parentheses. For the full list of control variables, see the Notes to Table 4.

<sup>&</sup>lt;sup>a</sup>: Measured by the average matriculation rate in between 1996 and 1998 in the high school attended.

b: Coefficient on the 1991 test score from a linear regression model. Robust t-statistic in parenthesis. The sample includes only students who ever attended high school (451 observations).

Table 6: Elementary School Quality and High School Outcomes for Other Israelis

		nt on High entile Dummy		nt on High entile Dummy
	Math	Verbal	Math	Verbal
Ever Attended 10 <sup>th</sup> Grade	0.009	0.012	0.003	0.007
	(3.90)	(5.28)	(1.33)	(2.52)
Ever Attended 11 <sup>th</sup> Grade	0.016	0.020	0.006	0.008
	(5.58)	(6.60)	(1.82)	(2.29)
Reached 10 <sup>th</sup> Grade Without	0.011	0.015	0.003	0.007
Repetition	(3.74)	(4.91)	(0.91)	(1.86)
Reached 11 <sup>th</sup> Grade Without	0.020	0.024	0.007	0.010
Repetition	(5.65)	(6.70)	(1.68)	(2.23)
Reached 12 <sup>th</sup> Grade Without	0.023	0.028	0.009	0.013
Repetition	(5.48)	(6.59)	(1.90)	(2.66)
Dropped Out Before Completing 12 <sup>th</sup> Grade	-0.020	-0.024	-0.008	-0.011
	(-5.51)	(-6.35)	(-2.07)	(-2.51)
Passing High School	0.082	0.106	0.043	0.064
Matriculation Exams	(9.45)	(12.38)	(4.81)	(6.63)
Quality of High School	0.094	0.117	0.038	0.053
Attended <sup>a, b</sup>	(13.12)	(17.22)	(6.00)	(8.14)
School and Locality Characteristics	No	No	Yes	Yes

**Notes**: The entries in the table represent the marginal effects estimated from separate probit models of the relevant outcome variable on a dummy variable equal to 1 if the average math score percentile in the elementary school attended was greater than 0.6. Robust z-statistics (adjusted for clustering) for the underlying probit coefficients in parentheses. School and locality characteristics include the school's socioeconomic index in 1991, an index of distance from the closest major urban center, income per capita in 1991, unemployment rate in 1991, percentage receiving welfare in 1991, dependency ratio in 1991, and average high school matriculation rate in 1991. Sample size: 48,662.

<sup>&</sup>lt;sup>a</sup>: Measured by the average matriculation rate in between 1996 and 1998 in the high school attended.

<sup>&</sup>lt;sup>b</sup>: Coefficient on the 1991 test score from a linear regression model. Robust t-statistic in parenthesis. The sample includes only students who ever attended high school (41,659 observations).

Table 7a: Elementary School Quality and High School Outcomes

	Coefficient on High Average Percentile Dummy, Math					
	(1)	(2)	(3)	(4)	(5)	
Ever Attended	0.024	0.024	0.028	0.028	0.044	
10 <sup>th</sup> Grade	(1.37)	(1.40)	(1.70)	(1.67)	(1.18)	
Ever Attended	0.022	0.021	0.036	0.033	0.070	
11 <sup>th</sup> Grade	(0.73)	(0.67)	(1.11)	(1.02)	(1.48)	
Reached 10 <sup>th</sup> Grade Without	0.039	0.034	0.041	0.032	0.075	
Repetition	(0.70)	(0.63)	(0.70)	(0.54)	(1.23)	
Reached 11 <sup>th</sup> Grade Without	0.098	0.092	0.098	0.093	0.108	
Repetition	(1.68)	(1.63)	(1.75)	(1.65)	(1.95)	
Reached 12 <sup>th</sup> Grade Without	0.085	0.081	0.084	0.077	0.084	
Repetition	(1.60)	(1.56)	(1.53)	(1.42)	(1.46)	
Dropped Out Before Completing	-0.035	-0.037	-0.040	-0.041	-0.025	
12 <sup>th</sup> Grade	(-1.44)	(-1.59)	(-1.64)	(-1.71)	(-0.66)	
Passing High School	0.084	0.088	0.080	0.078	0.122	
Matriculation Exams	(2.09)	(2.15)	(1.65)	(1.61)	(1.99)	
Quality of High School	0.070	0.066	0.036	0.036	0.012	
Attended a, b	(2.31)	(2.27)	(1.12)	(1.12)	(0.30)	
1991 Socioeconomic Index in Elementary School	Yes	Yes	Yes	Yes	Yes	
Percentage Ethiopians in Class	-	Yes	Yes	Yes	Yes	
School Locality Characteristics <sup>c</sup>	-	-	Yes	Yes	Yes	
Dummy for Caravan Site	-	-	-	Yes	Yes	
Locality of Residence Fixed Effects	-	-	-	-	Yes	

**Notes**: The entries in the columns (I)-(IV) represent the marginal effects estimated from separate probit models of the relevant outcome variable on a dummy variable equal to 1 if the elementary school's average percentile was greater than 0.6. The entries in column (V) represent the coefficients in a linear probability model. Robust z-statistics (adjusted for clustering) for the underlying probit coefficients in parentheses. For the list of control variables, see Notes to Table 4. Sample size: 48,662.

<sup>&</sup>lt;sup>a</sup>: Measured by the average matriculation rate in between 1996 and 1998 in the high school attended.

<sup>&</sup>lt;sup>b</sup>: Coefficient on the 1991 test score from a linear regression model. Robust t-statistic in parenthesis. The sample includes only students who ever attended high school (451 observations).

<sup>&</sup>lt;sup>c</sup>: School locality characteristics are measured in 1991 and are: income per capita, unemployment rate, rate of welfare recipiency, dependency ratio, and average high school matriculation rate.

**Table 7b: Elementary School Quality and High School Outcomes** 

	(	Coefficient on Hi	gh Quartile Sco	re Dummy, Ma	th
	<b>(I)</b>	(II)	(III)	(IV)	(V)
Ever Attended 10 <sup>th</sup> Grade	0.028	0.029	0.032	0.031	0.053
	(1.66)	(1.70)	(1.91)	(1.89)	(1.35)
Ever Attended 11 <sup>th</sup> Grade	0.034	0.032	0.051	0.048	0.083
	(1.14)	(1.07)	(1.63)	(1.57)	(1.67)
Reached 10 <sup>th</sup> Grade Without	0.069	0.064	0.086	0.079	0.100
Repetition	(1.27)	(1.21)	(1.51)	(1.37)	(1.80)
Reached 11 <sup>th</sup> Grade Without	0.125	0.118	0.142	0.137	0.135
Repetition	(2.21)	(2.15)	(2.59)	(2.50)	(2.69)
Reached 12 <sup>th</sup> Grade Without	0.115	0.110	0.130	0.126	0.116
Repetition	(2.20)	(2.17)	(2.41)	(2.32)	(2.24)
Dropped Out Before Completing 12 <sup>th</sup> Grade	-0.044	-0.047	-0.051	-0.051	-0.046
	(-1.90)	(-2.07)	(-2.03)	(-2.11)	(-1.11)
Passing High School	0.074	0.078	0.077	0.075	0.097
Matriculation Exams	(1.93)	(2.02)	(1.64)	(1.61)	(1.56)
Quality of High School	0.065	0.060	0.025	0.025	0.001
Attended a, b	(2.30)	(2.19)	(0.79)	(0.79)	(0.03)
1991 Socioeconomic Index in Elementary School	Yes	Yes	Yes	Yes	Yes
Percentage Ethiopians in Class	-	Yes	Yes	Yes	Yes
School Locality Characteristics Dummy for Caravan	-	-	Yes	Yes	Yes
Site	-	-	-	Yes	Yes
Locality of Residence Fixed Effects	-	-	-	-	Yes

**Notes**: The entries in the columns (I)-(IV) represent the marginal effects estimated from separate probit models of the relevant outcome variable on a dummy variable equal to 1 if the elementary school's quartile score was greater or equal to 6. The entries in column (V) represent the coefficients in a linear probability model. Robust z-statistics (adjusted for clustering) for the underlying probit coefficients in parentheses. For the list of control variables, see Notes to Table 4. Sample size: 48,662.

<sup>&</sup>lt;sup>a</sup>: Measured by the average matriculation rate in between 1996 and 1998 in the high school attended.

<sup>&</sup>lt;sup>b</sup>: Coefficient on the 1991 test score from a linear regression model. Robust t-statistic in parenthesis. The sample includes only students who ever attended high school (451 observations).

<sup>&</sup>lt;sup>c</sup>: School locality characteristics are measured in 1991 and are: income per capita, unemployment rate, rate of welfare recipiency, dependency ratio, and average high school matriculation rate.

**Table 8: Magnitude of the Effects** 

	Probab Success f	icted oility of or 5/1991 ans in: <sup>a</sup>	Compariso	udents with: b	
	Low	High	Father's	In the Same	In the Same
	Math	Math	Years of	Elementary	High School as
	Quality	Quality	Schooling $\leq$	School as 5/1991	May 1991
	School	School	8	Ethiopians	Ethiopians
Reached 12 <sup>th</sup> Grade Without Repetition	64.3	77.0	82.3	86.7	92.0
Passing High School Matriculation Exams	26.0	34.3	40.7	52.7	57.3

#### Notes

<sup>&</sup>lt;sup>a</sup>: The predicted probability of success for Ethiopian students is calculated by taking the probit coefficients from Table 5b, column (IV), and estimating the probability of success for an Ethiopian student with average characteristics in a low quality (low math quartile score) and high quality (high math quartile score) school respectively.

<sup>&</sup>lt;sup>b</sup>: Other Israeli students includes all native Jews not of Ethiopian origin, and immigrants from the former Soviet Union who arrived before 1989, and immigrants not of Soviet or Ethiopian origin.

#### Appendix A: The disparity between the old and new home environment

Disparities in the social and economic environments between Ethiopia and Israel were still very dramatic in 1990. The gap in GNP per capita was in a factor of 90, though only of 31 where the comparison is in terms of purchasing power parity (Table A1 in the appendix). The gap in (1990) mean years of schooling of the population is also quite dramatic, 8.8 in Israel versus 1.0 in Ethiopia. The health indicators reveal wide disparities in health status of the two countries populations. For example infant mortality in Ethiopia in 1990 (132) was thirteen times larger than in Israel (10) at the same year. Demographically, the Ethiopian community is comparatively young: over 50 per cent are aged eighteen or under. The community also contains a high percentage of both one-parent families (27 per cent) and large households with six or more members.

These differences between the two countries might be very relevant for the initial transition to life in Israel and, in the context of this paper, for the potential effect of school quality on learning of pupils who are not accustomed at all to western style schooling.

Table A1. Comparison of Ethiopia and Israel in 1990: Economic and Social Characteristics

<b>Economic development indicators</b>	Ethiopia	Israel
GNP per capita, 1990 \$	120	11,020
GNP per capita, 1990 (ppp\$)	350	10,860
Human Development Index	.166	.950
Population (%) with access to health services	46	100
Population (%) with access to safe water	19	100
Population (%) with access to sanitation	19	100
Education indicators		
Primary enrollment rate	38	93
Primary enrollment rate – Female	30	95
Secondary enrollment rate	.15	83
Secondary enrollment rate - Female	.12	86
Mean years of schooling	1.0	8.8
Adult literacy rate	50	95
Health indicators		
Infant mortality rate	132	10
Under five mortality rate	205	15
Crude death rate	18	6
Population per physician	78,780	350
Demographic indicators		
Crude birth rate	51	22
Total fertility rate	7.5	2.8

Sources: World Development Report, 1992, The World Bank and Human Development Report, 1991, The United Nations.

Appendix Table B1: Test of Balancing – Ethiopians Who Immigrated in the 1980s

School Quality Measures	Father's Years of Schooling	Mother's Years of Schooling	Male	Number of Siblings	Age in 1994
Average Math Score in 1991 (standardized)	0.028	0.044	0.133	0045	0.136
	(2.22)	(2.98)	(1.46)	(-1.74)	(1.51)
Average Verbal Score in 1991 (standardized)	0.031	0.052	0.104	-0.051	0.041
	(2.28)	(2.99)	(1.38)	(-1.81)	(0.39)
1991 Socioeconomic	0.071	0.081	0.067	-0.091	-0.154
Index <sup>a</sup>	(3.54)	(3.6)	(0.58)	(-2.4)	(-1.29)
Income per Capita, 1991	1.8	2.061	-0.568	-1.646	13.113
	(0.85)	(0.83)	(-0.04)	(-0.47)	(1.08)
Average Matriculation	0.267	0.311	-0.035	-0.133	0.989
Rates, 1992/93	(2.18)	(2.34)	(-0.03)	(-0.62)	(1.21)
Welfare Recipients,	0.027	0.034	0.111	-0.012	0.055
1991 <sup>a,b</sup>	(2.59)	(2.65)	(1.03)	(-0.58)	(0.62)
UI Recipients,	0.004	0.005	0.006	-0.002	0.008
1991 <sup>a,b</sup>	(3.47)	(3.22)	(0.72)	(-0.85)	(1.06)
Dependency Ratio,	-0.004	-0.014	-0.109	0.007	-0.027
1991 <sup>a,b</sup>	(-0.32)	(-0.99)	(-1.77)	(0.4)	(-0.5)

**Notes**: The entries in the table represent the coefficients from separate univariate regressions of the school characteristics variables on the background characteristics. Robust t-statistics (adjusted for clustering) in parentheses. <sup>a</sup>: Standardized to have mean 0 and standard deviation 1.

b: Transformed so that high values of the variable represent good outcomes: low welfare recipiency rates, low unemployment, low dependency ratios.

**Appendix Table B2: Test of Balancing – Former Soviet Union Immigrants** 

School Quality Measures	Father's Years of Schooling	Mother's Years of Schooling	Male	Number of Siblings	Age in 1994
Average Math Score in 1991 (standardized)	0.013	0.023	-0.017	-0.103	0.022
	(3.73)	(4.11)	(-0.39)	(-4.49)	(0.87)
Average Verbal Score in 1991 (standardized)	0.014	0.022	-0.011	-0.108	0.018
	(3.8)	(3.57)	(-0.22)	(-4.75)	(0.69)
1991 Socioeconomic	0.017	0.028	-0.01	-0.145	-0.007
Index <sup>a</sup>	(5.87)	(7.03)	(-0.32)	(-5.69)	(-0.31)
Income per Capita, 1991	1.04	0.871	-0.399	-17.167	-5.835
	(1.04)	(0.59)	(-0.07)	(-2.87)	(-0.77)
Average Matriculation	0.143	0.249	0.727	-1.9	-0.184
Rates, 1992/93	(2.94)	(2.8)	(1.88)	(-3.45)	(-0.3)
Welfare Recipients,	0.009	0.016	0.037	-0.136	0
1991 <sup>a,b</sup>	(2.47)	(1.99)	(1.17)	(-3.73)	(0)
UI Recipients,	-0.002	-0.001	0.017	-0.018	-0.008
1991 <sup>a,b</sup>	(-0.6)	(-0.37)	(1.02)	(-1.74)	(-1.7)
Dependency Ratio,	-0.004	-0.003	0.008	-0.05	-0.031
1991 <sup>a,b</sup>	(-0.83)	(-0.42)	(0.34)	(-2.21)	(-0.8)

**Notes**: The entries in the table represent the coefficients from separate univariate regressions of the school characteristics variables on the background characteristics. Robust t-statistics (adjusted for clustering) in parentheses. <sup>a</sup>: Standardized to have mean 0 and standard deviation 1.

b: Transformed so that high values of the variable represent good outcomes: low welfare recipiency rates, low unemployment, low dependency ratios.

Appendix Table B3: Test of Balancing – Other Jews <sup>a</sup>

School Quality Measures	Father's Years of Schooling	Mother's Years of Schooling	Male	Number of Siblings	Age in 1994
Average Math Score in 1991 (standardized)	0.035	0.037	0.012	-0.081	-0.085
	(11.99)	(11.25)	(1.01)	(-7.63)	(-5.46)
Average Verbal Score in	0.045	0.047	0.013	-0.081	-0.103
1991 (standardized)	(16.11)	(14.63)	(1.13)	(-7.67)	(-6.45)
1991 Socioeconomic	0.051	0.055	-0.008	-0.145	-0.135
Index <sup>b</sup>	(19.49)	(18.24)	(-0.65)	(-12.09)	(-8.38)
Income per Capita, 1991	5.715	6.157	0.815	-27.176	-21.45
	(2.52)	(2.44)	(0.35)	(-6.54)	(-2.87)
Average Matriculation	0.544	0.573	0.145	-1.503	-1.5
Rates, 1992/93	(5.31)	(5)	(0.95)	(-5.71)	(-3.55)
Welfare Recipients,	0.028	0.03	0.017	-0.096	-0.099
1991 <sup>b, c</sup>	(5.07)	(4.74)	(1.75)	(-5.16)	(-3.54)
UI Recipients,	0.002	0.001	-0.007	-0.024	-0.005
1991 <sup>b, c</sup>	(1.25)	(0.78)	(-0.85)	(-1.49)	(-0.56)
Dependency Ratio,	0.006	0.007	-0.008	-0.128	-0.033
1991 <sup>b, c</sup>	(0.67)	(0.79)	(-0.86)	(-6.42)	(-1.08)

**Notes:** The entries in the table represent the coefficients from separate univariate regressions of the school characteristics variables on the background characteristics. Robust t-statistics (adjusted for clustering) in parentheses.

<sup>&</sup>lt;sup>a</sup>: Other Jews: Native Israelis not of Ethiopian origin, and immigrants from anywhere except Ethiopia and the Soviet Union.

b: Standardized to have mean 0 and standard deviation 1.

<sup>&</sup>lt;sup>c</sup>: Transformed so that high values of the variable represent good outcomes: low welfare recipiency rates, low unemployment, low dependency ratios.