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# Private Education Provision and Public Finance

The Netherlands

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# **Abstract**

One of the key features of the Dutch education system is freedom of education—freedom to establish schools and organize teaching. Almost 70 percent of schools in the Netherlands are administered by private school boards, and all schools are government funded equally. This allows school choice. Using an instrument to

identify school choice, it is shown that the Dutch system promotes academic performance. The instrumental variables results show that private school attendance is associated with higher test scores. Private school size effects in math, reading, and science achievement are 0.17, 0.28, and 0.18.

This paper—a product of the Education Team, Human Development Network—is part of a larger effort in the department to study the impacts of public-private partnerships. Policy Research Working Papers are also posted on the Web at http://econ.worldbank.org. The author may be contacted at hpatrinos@worldbank.org.

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# PRIVATE EDUCATION PROVISION AND PUBLIC FINANCE:

# THE NETHERLANDS

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### WORLD BANK

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### INTRODUCTION

One of the key features of the Dutch education system is freedom of education – freedom to establish schools, determine the principles on which the school is based, and organize classroom teaching. In fact, the Netherlands has one of the oldest national systems based on school choice in the world. Although all schools in the Netherlands are government funded, most are administered by private school boards. As a result, most children in the Netherlands attend private schools, a trend that has been increasing over the past 150 years. Parents can choose among several schools, and school choice is often promoted by the government as a way to increase competition in the school system. Efficiency increases as public and private schools try to improve their outcomes to develop a good reputation and thus attract more students.

School choice is often promoted as a means of increasing competition in the school system (Friedman 1955). It is believed that competition will lead to efficiency gains as schools – public and private – compete for students and try to improve quality while reducing expenses (Hoxby 2003; Neal 2002). By encouraging more private schools, vouchers will allow school managers to become innovative and thereby bring improvements to the learning process. Public schools, in order to attract the resources that come with students, will need to improve. Thus, school choice will lead to improved learning outcomes and increased efficiency. Opponents claim that under a voucher system private providers will be unaccountable to tax payers and the public. Claims of efficiency gains are also questioned. Further, opponents sometimes claim that choice will lead to privatization, less public (government) control of education, and increased segregation (Ladd 2002). The United States literature on school choice is extensive (see Peterson 2009 for a recent review). The international literature is small, but growing (see Barrera-Osorio and Patrinos 2009 for a recent review).

However, most of the literature has focused on small-scale choice systems (such as in a number of cities in the United States). Denmark's large and mature voucher system has been researched. Andersen (2005), Andersen and Serritzlew (2006), Nannestad (2004) and Rangvid (2008) reach the conclusion that, despite increments in competition, private schools do not perform academically better than public ones. These analyses suffer from weak instruments and non-robust methodologies. For the case of Sweden, Ahlin (2003) estimates the effect of a general school choice reform on student performance. Using a rich set of individual level data, increased school competition is shown to have statistically significant positive effects on student performance in mathematics, but no significant effects in English and Swedish. Interacting school competition with student characteristics, the results indicate that immigrant students and those in need of special education tend to gain more from increased school competition than others, while adverse effects on students from low education families are found in terms of English and Swedish performance. Also for Sweden, Sandström and Bergström (2004) analyze the effects of competition on public schools using data on 28,000 ninth graders. They account for potential endogeneity of the share of students attending independent schools by using instrumental variable estimation. Their findings support the hypothesis that school results in public schools improve due to competition. Research on Chile's universal school choice model has been subject to a high level of scrutiny. The research is controversial, with several early articles presenting data to show that subsidized, private schools obtain higher standardized test scores than do public schools (Rodriguez 1988; Aedo and Larranaga 1994; Aedo 1997). A second batch of studies uses individual level information with large samples (Bravo et al 1999; Carnoy and McEwan 2000; Mizala and Romaguera 2000; Gallegos 2002; Vegas 2002). Several studies advance the previous estimations, with strategies to overcome the problem of selfselection. Sapelli and Vial (2002, 2004) have taken into account some of the deficiencies of previous studies, especially in terms of lack of control for selection bias, homogenous treatment effects, and assumptions of equal funding for voucher schools. These studies present small average treatment effects but large treatment on the treated effects. They also reject the hypothesis that peer effects explain the positive results. However, Hsieh and Urquiola (2006), using several instruments and over-time data, find no evidence that choice improved average educational outcomes as measured by test scores, repetition rates and years of schooling. They find that the voucher program led to increased sorting, as the best public school students left for the private sector. Gallegos (2006) explains that the differences in results can be attributed to changes in the voucher and education systems in the mid-1990s. He uses information on the number of Catholic priests in 1950 and the institution of the voucher system in 1981 as an exogenous determinant of the supply of voucher schools and shows that vouchers increase tests scores. For Colombia's targeted secondary school voucher program, researchers take advantage of a randomized design (Angrist et al 2002, 2006). The Colombian program found that voucher beneficiaries had higher educational attainment: they were 10 percent more likely to finish the 8th grade three years after they won the vouchers, 5 to 6 percent less likely to repeat a grade, they scored 0.2 standard deviations higher on achievement tests than non-voucher students, and they were 20 percent more likely to take the college entrance exam than students who had not won a voucher in the lottery.

The Netherlands provides an ideal situation to examine the effects of school choice in a long-standing system. Interestingly, the issue of choice in the Netherlands has been understudied (but see Ritzen et al 1997; Himmler 2007). In the Dutch national school choice system, policy is determined centrally but the administration and management of schools is decentralized

to the school level. The central government exercises ultimate control over both public and private schools. Students from the Netherlands do exceptionally well on international academic achievement tests such as TIMSS and PISA. The country achieves high scores even after controlling for national income and expenditure per student. Thus, the system is not only successful academically but is also cost effective, yielding good results at relatively low cost. The substantial degree of competition in the system is one determinant of its high academic achievement rates. Thus, a large school choice system can promote efficiency and equity without necessarily leading to privatization or to reduced public scrutiny. All this lends credence to the arguments of the proponents of school choice.

To what extent is student academic achievement in the Netherlands due to school choice? If school choice leads to competition, this can manifest itself in, among other things, schools becoming more effective in managing personnel, teaching students, promoting school efficiency, managing budgets, and involving parents as appropriate. That is, attendance at a private school can lead to superior performance. Given the predominance and growing significance of private schools in the Netherlands, and the ease of entry of new providers, this might be a useful measure of the effect of school choice on outcomes. In fact, Dutch private schools outperform public schools despite 100 years of competition and equal funding to both sectors.

We show that a significant part of the high achievement of Dutch students in international achievement tests is due to the institutional features associated with school choice. We address the selection problem with information on the act of school choice in the Netherlands. We show that when we instrument for school choice, then private school attendance is associated with higher test scores. Private school size effects in math, reading and science are high and

significant, close to 0.2 of a standard deviation in math and science, and almost 0.3 of a standard deviation in reading.

### THE NETHERLANDS' SCHOOL CHOICE SYSTEM: AN OVERVIEW

The current Dutch education system, established in 1917, provides an ideal environment through which the impact of school choice can be examined. The "schools to the parents" movement created a system unparalleled elsewhere in which parents have true freedom over education in that they can choose whatever school they wish for their children while the state pays most of the cost. Freedom of education is guaranteed under Article 23 of the Constitution, which ended the state monopoly in education early on in the Netherlands. Along with school choice, all parts of social life were segmented – often referred to as "pillarisation" (verzuiling), in the literature – for a period as long as 1870 to 1960 as part of a political compromise (James 1984). Not only were schools organized along political and religious lines, but so too were other aspects, such as political parties, trade unions, business associations, professional groups, sports clubs, and so on, into different blocs based on religious and ideological basis (Roman Catholic, Protestant, liberal and social-democratic). While the segmentation has ended, interestingly enough, schools continue to be oriented in a particular way, despite the fact that Dutch society has changed considerably. Nevertheless, freedom of education in the Netherlands was not originally based so much on principals of equality and liberalism, but rather on freedom of religion, in a more conservative perspective (Patrinos 2002).

Most schools are private, usually managed by a foundation or church. Municipal authorities are the competent local authority for schools in the area. All schools are governed by a legally recognized authority (school board). The school board is responsible for implementing

legislation and regulations in schools. There is, despite school choice and diversity of supply, no significant elite school sector (Karsten et al 1995). It is required that primary and secondary schools receiving public funds must be not-for-profit. Nevertheless, school boards are able to retain surplus earnings. There are a few for-profit schools, representing less than 1 percent of total enrollments (Hirsch 2002), but they are too small to receive government funds.

There is relative ease of entry of new providers. A small number of parents can and do propose to start a school. Government is required to provide initial capital costs and ongoing expenses, while the municipality provides buildings. A small fund for operating expenses that the school may allocate at its discretion among activities such as maintenance, cleaning, heating, libraries and teaching aids also exists. The sum is determined separately by each municipality, which must then give all public and private schools the same per capita amount. The requisite number of parents required to set up a school varies according to population density, from 200 for small municipalities to 337 for The Hague.

Each family is entitled to choose the school – public or private – they want and the state pays. The main impediment to choice is distance, although parents are free to choose a school anywhere in their city of residence or indeed anywhere in the country since there are no catchment areas. Public schools must admit all pupils and most pursue non-restrictive admissions policies. A school cannot refuse to admit a child if parents are unable or unwilling to pay. Once it is certain that a child is to be admitted to the school, a written contract must be drawn up between the school and the parents, stating what the parental contribution is to be used for and what will happen if it is not paid in full.

Money follows students and each school receives for each student enrolled a sum equivalent to the per capita cost of public schooling (Patrinos 2002). The school that receives

the funds is then entitled to funding that will cover specified amounts of teacher salaries and other expenses. The number of teachers to which a school is entitled depends on its number of students. Private schools can and do supplement this funding by charging ancillary fees; however, this right is severely limited. There is no evidence of refusing at-risk students (Karsten and Meijer 1999). Municipal schools charge small fees during the 12 year compulsory stage of schooling. Schools are fully accountable towards the parents for the use of fees collected. Other private contributions and sponsorship are allowed, but no advertising materials are permitted, and schools may not become dependent on sponsors (Droog 2001; de Vijlder 2001). The central government pays most of the running costs. Limited local government discretion is allowed. Staff costs are funded according to the number of students enrolled, as well as running costs and Municipalities organize and pay for minority language teaching. supplementary staffing. Salaries are based on fixed scales that take into account education and experience. While the freedom to organize teaching means that schools are free to determine how to teach, still the Ministry of Education, Culture and Science does, however, impose a number of statutory standards in relation to the quality of education. These prescribe the subjects to be studied, the attainment targets and the content of national examinations. There are also rules about the number of teaching periods per year, teacher training and teaching qualifications, the rights of parents and pupils to have a say in school matters, and the planning and reporting obligations of schools. As a rule, schools enjoy considerable freedom in the choice of textbooks and materials and in the way they manage their affairs. The Education Inspectorate is charged by the Minister of Education with supervising the manner in which schools fulfill their responsibilities. The financing procedure is somewhat different at the secondary level. All teacher salaries and building costs are covered directly by the municipality. In addition, municipal and private

secondary general schools that are included in the Minister of Education's three-year plan get the same discretionary fund per capita. Since 80-90 percent of all current school expenditures are for teacher salaries, this immediately places the bulk of budgetary decisions in the hands of the central government.

Central standards remain. School discretion is limited only by employment laws; teacher qualifications, pay and conditions; and building standards. Funding mechanisms are designed to control national expenditures. Poor schools try to cut costs by improving efficiency, such as more extensive methods of teaching. The Dutch education system combines centralized education policy with decentralized administration and management of schools. Central control is exercised over both public and private schools. The system is characterized by a large central staff; many school advisory services and coordination bodies; a strong Inspectorate; and stringent regulations.

### TRENDS AND EFFECTS OF SCHOOL CHOICE

Most children in the Netherlands attend private schools (Figures 1 and 2) and the trend over the past 150 years is increasing. Most school boards are Catholic or Protestant, but there are also Jewish, Islamic, Hindu and humanist schools in the Netherlands. While 35 percent are public, 29 and 27 percent are Catholic and Protestant (Hupe and Meijs 2000). There are also private non-denominational schools that are run by an association or foundation but are not based on any specific religious or ideological beliefs. Like some public schools, many privately run schools base their teaching on specific educational principles.

The Dutch system is relatively efficient. Education in the Netherlands is free for the compulsory, first ten years of schooling. At all levels of education, the Dutch government

spends at the OECD average (OECD 2009). Education spending as a proportion of GDP is 4.8 percent. Thus, achievement levels are high, while relative costs are low. To deal with disadvantage, a weighted funding formula is used. For every ethnic minority student, a school receives 1.9 times the amount paid for other children. This is extra funding for personnel. Native children from disadvantaged backgrounds receive 1.25 times the amount (Ritzen and others 1997; see Leuven et al. 2007 for an evaluation).

In 1997, the daily newspaper *Trouw* (www.trouw.nl) went to court for the right to publish education Inspectorate results. When Trouw published the results of all schools later that year, the newspaper was sold out in a matter of hours. This demonstrates the significant demand for information on school quality. From then on this newspaper published articles on the quality of schools every year and it also opened a website so that citizens could view this information all year round (http://www.trouw.nl). A survey in 1998 reported that 91 percent of respondents believed that Inspectorate reports should be made public. The increased transparency led to drastic changes in the Inspectorate service. The agency decided that it would also publish the results of school inspections itself. The Inspectorate even redefined its task and stated that one of its tasks was to provide citizens with independent and reliable information about the quality of schools (Meijer 2007). The Inspectorate opened a website and first published quantitative information concerning the quality of schools – the so-called Quality Cards – in 1998 (http://www.kwaliteitskaart.nl). Approximately 200 inspectors make more than 10,000 visits to schools every year. While observing lessons, the inspectors also assess teaching methods. Every year, the Inspectorate submits around 25 reports, including the annual Education Report, to the Minister, the State Secretaries and the Parliament. The results of the Inspectorate reports can be used to put schools on notice if quality is poor, and action is taken by the Ministry of Education

if schools do not improve. Curiously, it was once believed that parents did not want test data published (Louis and van Velzen 1991).

The Netherlands scores high in international academic achievement tests. For example, in Trends in International Mathematics and Science Study (TIMSS), Netherlands scored near the top in both subjects in 2007, repeating its performance in earlier years, such as 2003, 1999 and 1995. The Netherlands consistently scores in the top ten in math and science. Also, in mathematics and science achievement in the final years of secondary school, carried out by TIMSS in 1995 in 21 countries, the Netherlands was the top performing country. The Netherlands achieves high scores in TIMSS, in comparison to other countries, even when controlling for level of national income (as well as expenditure per student).

In the OECD's Programme for International Student Assessment (PISA), the Netherlands does very well. In all three subjects, math, science and reading, the Netherlands consistently scores above the OECD average. In math, the Netherlands ranks fourth of all participating countries, scoring 0.3 of a standard deviation above the OECD average. In science, the Netherlands ranks 8<sup>th</sup> and in reading 11<sup>th</sup> (see Table 1).

### ASSESSING THE IMPACT OF SCHOOL CHOICE IN THE NETHERLANDS

Previous research has found that confessional schools perform better than public schools (see, for example, Dijkstra et al 2001). Despite the fact that there is no elite school sector, there is some evidence of higher quality in private schools, especially Catholic and Protestant secondary schools (Dronkers 1995). A careful analysis of school performance in the Netherlands shows that Catholic schools do out-perform other schools, especially public schools (Levin 2002). The superior performance holds even after controlling for educational practices and

selection. The results show that Catholic schools do perform better, while schooling choice is available and affordable for the majority of families.

To what extent is this high achievement due to the institutional features associated with school choice? School choice leads to competition which can manifest itself in schools firing ineffective teachers for instance; or through schools using achievement data to evaluate teachers. School autonomy can also lead to schools taking a more direct role in establishing teachers' salary increases among other school functions. In addition, parents may be more involved in discussions on budget formulation at the school level. Another variable that might help explain superior performance is attendance at a private school. Given the predominance and growing significance of private schools in the Netherlands, and the ease of entry of new providers, this might be a useful measure of the effect of school choice on outcomes. In the Netherlands, on average, private schools perform slightly better than public schools – despite 100 years of competition and equal funding to both sectors – and all perform significantly above the OECD mean. Figure 3 shows the slight advantage of private schools in PISA 2006.

# **Data and Coverage**

In the analysis that follows, we use data from the OECD's Program for International Student Assessment (PISA), a student assessment jointly developed by participating countries to assess and compare student achievement based on a standardized and highly reliable framework. The detailed description of assessment framework, cautious procedures of translation and supervision of country specific implementations, and finally careful calibration of student scores based on response items and collected background variables, supports the view that PISA is a valid framework for assessing student achievement. The survey is realized as representative to

the population of interest in a two-stage stratified sample with random sampling of schools and within each school. Survey weights reflect the different probabilities of schools and students to be sampled. The domains of reading, mathematical and scientific literacy are covered not merely in terms of mastery of the school curriculum, but in terms of important knowledge and skills needed in adult life, particularly in the labor market (OECD 2007).

Table 2 presents descriptive statistics. Most schools in the Netherlands PISA 2006 sample are private. Most schools can fire a teacher, which is not unexpected since most schools are private, but in the Netherlands almost all schools can fire teachers. Achievement data is used to evaluate teachers in most schools, with almost three-quarters saying that it is so. Also evident is the high degree of school-based management in the Netherlands, as more than 80 percent of schools report that they can set teacher salary increases. Few schools directly involve parents in school budget decisions, at only 9 percent overall. Teachers in the Netherlands are certified, and few schools are located in rural areas. In terms of differences between public and private schools, there is a slightly higher probability that public schools can fire teachers in the Netherlands, and parental involvement in school budget decisions is higher in public schools. Religion is more important for choosing private schools. The student-teacher ratio is slightly lower in private schools. Private school students have mothers who are relatively less educated. Only 26 percent of the mothers of private school students have a university education, while more than 33 percent of the mothers of public school students have a university education mother.

# **Measuring the Effects of Choice on Achievement**

Controlling for a series of institutional, school, student and family characteristics, and running a series of OLS regressions, it turns out that private school attendance is a positive and significant explanatory variable, though the effect is very small, except in the case of science, where it has no effect (Table 3). Private school attendance increases test scores in math by no more than 5 points and 4 points in reading. Given the PISA scale – mean OECD score of 500 and standard deviation of 100 points – these are very small size effects. In the case of science, the effect is not significant.

However, other institutional variables have a strong effect, such as firing teachers, especially in science. The effect varies from 20 points in reading, or 0.20 of a standard deviation, to 43 in math and 73 in science. However, most schools report that they can fire teachers in the Netherlands. Assessment is important in the Netherlands and many schools use achievement information to assess progress. This has a small but positive and significant effect on outcomes, about twice the size effect of private school attendance. The same goes for schools setting teacher salary increases. Overall, 8 to 10 points increase is associated with schools setting teacher increases. Parental involvement in school budget decisions is associated with higher scores, raising achievement by 11 points in math, to 14 points in science, and by 16 points in reading. Therefore, the OLS analysis suggests that institutional factors are more important than private school attendance in determining achievement in the Netherlands. It is important to bear in mind however that the OLS results are correlations, and not causal relationships. We turn now to the identification problem.

# **Identification**

Private school attendance is associated with self-selection in the Netherlands given universal school choice, so one cannot attribute from the regression results that private schools contribute to the increase in test scores. There are two main channels through which a school choice program can increase learning outcomes: the mechanism it uses to sort students and the across-school competition it creates. For the first channel, choice programs may allow a better fit between parental preferences and schools. Presumably, families will enroll their children in high-performing schools, either leaving or not applying to low-performing schools. This allocation mechanism will induce students to improve educational outcomes because they will be in better schools. For the second channel, choice may induce competition for students across schools. Low-performing schools will be forced to increase their quality in order to retain and attract students who will otherwise enroll in better schools (Hoxby 2003; Neal 2002).

The average learning outcome then will depend on the average outcomes of students who stay in the low-performing schools (expellers) and those who move to the high-performing schools (receivers) (Nechyba 1999, 2000; Epple and Romano 1998). On top of this sorting mechanism of students, competition across schools will tend to increase the quality of education. Again, schools will compete for students which may lead to improved learning outcomes. Final outcomes will depend on the net effect of these margins.

The typical estimation of the effect of a choice program on learning outcomes will have the form:

$$Y_{i,j,t} = \beta_0 + \beta_1 * X_{i,t} + \beta_2 * Z_{j,t} + \beta_3 * D_{i,j,t} + \varepsilon_{i,j,t}$$
(1)

where  $Y_{i,t}$  is any variable capturing learning outcomes such as standardized test score for individual i in school j at time t;  $X_{i,t}$  are a set of socioeconomic characteristics of the individual;

 $Z_{j,t}$  are characteristics of the school such as teachers;  $D_{i,j,t}$  is a dummy variable indicating whether the individual is a beneficiary of choice or not;  $\varepsilon_{i,j,t}$  comprises all unobservable characteristics of the school and individual that can affect learning outcomes.

The fundamental problem in estimating the impact of choice programs with equation (1) is selection bias—students and schools self-select into the program. Under these conditions, a comparison between students who participate and those who do not confounds the effects of the program, with the initial differences in characteristics between participants and non-participants. For example, it is possible to expect that better informed households are more likely to actively choose schools. Students from these households may perform differently than less active choosers. Therefore, any observed final educational outcomes not only comprise the results from the choice program but also the inherent differences in characteristics of the families or students. Besides students self-selecting into the program, schools may also self-select into the program or select students, reinforcing the problem of identifying impacts. An evaluation of the choice program with this behavior may thus confound the impact of the program with the differences in the characteristics of the schools. Therefore, a simple comparison between students in schools with the program and without the program may pick up not only the differences in the educational outcomes due to the voucher program, but also the differences in the characteristics of the two groups of schools. In the Netherlands, fortunately for the purposes of evaluation, schools do not select nor reject students and all schools are part of the choice program, so we do not have this sort of problem in the Netherlands.

In short, the main objective of this type of estimation is to identify  $\beta_3$ . If the program does not assign the students randomly, then it is very likely that the unobservable characteristics are correlated with the dummy that indicates whether or not the individual receives the program.

In this case,  $E(\varepsilon_{i,j,t}/D_{i,j,t}) \neq 0$ , and ordinary least squares (OLS) estimators are biased. This can be described as a problem of causality. If D is determined with self-selected individuals, and the most able ones are participating in the program, then D can be causing Y. On the other hand, Y as indicative of ability can be *causing* D, in the sense that more able individuals are choosing to be in the program. Therefore, the causality direction is unclear. Another perspective of the problem is to see bias as the consequence of omitted variables. In this case  $\varepsilon_{i,j,t}$  captures all the unobservable variables at the school and individual level that affect Y. If it were possible to control for all the variables such as  $E(\varepsilon_{i,j,t}/D_{i,j,t}) = 0$ , then OLS would be unbiased. In other words, if we can control for all the key variables that determine participation in the program, estimates by OLS will be unbiased. The direction of the bias in simple comparisons between students with vouchers and other students is not clear.

The problem of bias in the estimation of equation (1) has multiple solutions. If randomization and regression discontinuity techniques are not an option, then one must opt for other methods, such as instrumental variables, Heckman correction models, difference-in-difference estimators and matching estimators. However, they are all based on strong assumptions (Angrist and Imbens 1995; Athey and Imbens 2006; Heckman 1976; Heckman, Ichimura and Todd 1998; Rosenbaum and Rubin 1983). In the Netherlands, there is no preprogram data, given the long standing nature of the program. There are also no exclusion criteria, since all families and students have access to all schools, schools do not reject applicants, and there are no top up fees.

Our empirical strategy is to locate a variable that matters for the treatment status or more generally for participation – relevance of the instrument – but that is not correlated with the outcomes of interest given treatment – exclusion restriction. The instrument will control for the

endogeneity in the choice variable (enter a private school) that arises from selection on unobservables. In student achievement regressions, school choice is usually instrumented with variables related to the cost of schooling: price of schooling and distance to the school. However, these variables might violate the exclusion restriction if distance is correlated with absences or tardiness – likely to affect learning – or if the price of schooling also depends on the demand for schooling. Another possibility when past (pre-program) data are available is to use lagged (pre-program) values of participation determinants as instruments. However, because past determinants are strongly correlated with current determinants, they are arguably weak instruments (Blundell and Costa Dias 2000; Davidson and MacKinnon 2003). Researchers investigating universal choice programs have used various techniques to create treatment groups. Instrumental variables have been used in the cases of Denmark and Sweden, such as the degree of competition. Others have used school location and find mixed effects across country (Vandenberghe and Robin 2004). Religion has also been used as an instrument. In Chile, Gallegos (2006) used religion and showed that an increase of one in the ratio of voucher-topublic schools increases tests scores by about 0.14 standard deviations. West and Woessmann (2008) argue that nineteenth-century Catholic doctrine strongly opposed state schooling and show that countries with larger shares of Catholics in 1900 (but without a Catholic state religion) tend to have larger shares of privately operated schools today. They show that larger shares of privately operated schools lead to better student achievement in mathematics, science and reading, and to lower total education spending, even after controlling for current Catholic shares (West and Woessmann 2008; see also Card, Dooley and Payne 2007; Evans and Schwab 1995; Neal 1997; Jepsen 2003; Sander 1996 on the use of Catholic shares as instruments; and see Cohen-Zada 2009 for an alternative instrument that uses historical Catholic share of population

as an instrument; but see Altonji, Elder, and Taber (2005) on cautions about using such instruments. Thus, an instrumental variables approach is undertaken to address the causality issue. However a good instrument should be good at predicting choice, but not achievement.

Here we exploit information on the act of school choice in the Netherlands. There is a diversity of providers in the Dutch market. In addition to public schools, managed at the municipal level, the private school sector is composed of religious and secular schools. The religious school sector is dominated by Catholic and Protestant managed schools, but includes other providers as well. In fact, two-thirds of all schools in the Netherlands are private. Moreover, most private schools are religious in nature, at 91 percent; and religious schools make up 59 percent of all schools in the Netherlands. There is evidence that parents are active choosers, basing their decision at times on religion. According to research, more than 50 percent of parents choose schools based on religion (Teelken 1998). This suggests that religion would be a good instrument for private school choice. In the Netherlands, we know that religion is important in the selection of schools. Himmler (2007) used an Instrumental Variables approach for analyzing school achievement in the Netherlands. He controlled for the possible endogeneity of Catholic school competition to public school quality. He found a positive link between competition intensity and academic achievement in secondary school.

Fortunately, PISA 2006 asks the school principal if parents' endorsement of the instructional or religious philosophy of the school is taken into consideration at the time of admission, meaning that parents express an interest in the religious orientation of the school (see PISA School questionnaire). We shall use this as an instrument for parental preference or choice based on religion. In the Netherlands, according to PISA 2006, 38 percent of parents choose

schools based on religion. It appears that religion is a good variable for predicting private school choice, but not a determining factor of academic performance. In an equation of the form:

$$D_{i,j,t} = \beta_0 + \beta_1 RELIGION_{i,t} \tag{2}$$

Where *D* is private school attendance, *Religion* is a 0,1 dummy variable and if 1, means that parents choose schools based on religion and 0 otherwise, as derived from the PISA questionnaire, it is estimated that *Religion* is a good predictor of private school choice:

$$D = 0.54 + 0.37 RELIGION, R-squared = 0.145$$
 (0.03)

At the same time, *Religion* it is not very much correlated with achievement:

$$Y_{math} = 523.2 + 19.7 \ RELIGION, R-squared = 0.0124$$
(4.8)

$$Y_{reading} = 497.6 + 24.3 RELIGION, R-squared = 0.0159$$
(5.1)

$$Y_{science} = 517.8 + 18.6 RELIGION, R-squared = 0.0095$$
(5.4)

The variable *Religion* therefore is used as an instrument for private school attendance. We estimate the impact of private school attendance using instrumental variables. The IV results show that private school attendance is associated with higher test scores (Table 4). The true effect of private schools is higher than in the base (OLS) equation. In fact, the true effect is at least three times what one obtains in the OLS regressions. Moreover, the effect size is higher and the private school variable becomes positive and significant in the case of science. Private school size effects in math, reading and science achievement are 0.17, 0.28 and 0.18, all significant. Given PISA's scaling, this is close to 0.2 of a standard deviation in the case of math

and science, and almost 0.3 of a standard deviation in reading. In other words, these are large effect size effects, indicating that school choice contributes to achievement in Netherlands.

In the case of math outcomes, the private school attendance is associated with a significant effect size of 0.17 of a standard deviation. This is much higher than what one obtains with OLS. It is also interesting that there is a substantial change in at least one of the institutional variables. That is, the coefficient on firing teachers is reduced by 20 percent, or 9 points, while at the same time private schooling increases three-fold, by 12 points. In reading, the impact of private schooling is much higher in the IV results. In fact, when instrumented private school attendance has a six times higher effect size than in OLS. Also, for reading, the impact of firing teachers is substantially reduced in the IV results, by more than 87 percent or points; at the same time, the impact of private schooling increased by 24 points. In science, when estimated using OLS, private schooling had no effect, and the coefficient was insignificant. Moreover, the impact of firing teachers was huge, at over 70 points. However, in the IV results, the firing teachers variable is substantially reduced, falling by more than 24 points. At the same time, private schooling increases from a small, even *negative*, but insignificant effect in OLS, to a large, positive and significant effect in the IV results. The private school effects are large and significant, suggesting that private schools have a positive effect on learning outcomes, even controlling for institutional factors and a host of other controls.

Therefore, one may reject the null hypothesis that private schools have no impact on cognitive ability. The private school effect implies that school choice is beneficial for improving cognitive ability. The difference between the OLS and IV results further suggests that private schooling's true impact works through the competition that the Dutch system promotes. Parents are able to choose among a variety of providers, thus ensuring that tastes and preferences are

catered to. The competitive funding system promotes innovation, efficiency and excellence. The competition that is created in the Dutch market leads to efficiency gains as schools are able to cater to different markets and parents exercise their choice to find the provider for their children that best fits their needs. The system is also highly equitable. Although there are competition effects whereby private school students achieve slightly higher than public school students, nevertheless the system overall boasts high average attainment levels. That is, achievement is high for all groups, with the average score of Dutch students significantly above the OECD average in all three subjects.

The question that remains is why we obtain such a large impact of private schools when the raw differential is so small? In other words, the test score outcomes of public and private schools are almost equal. Moreover, choice and competition has existed for almost 100 years. Yet when we control for selection we obtain a positive impact of attending private schools. The answer may lie in the fact that the competition that is created in the market leads to efficiency gains as schools are able to cater to different markets and parents exercise their choice to find the provider for their children that best fits their needs. In fact, the students of private schools come from slightly less well-off families. This is evident in Table 2 which shows that the mothers of private school students are slightly less well educated than the mothers of students in public schools (see also Figure 4). Therefore, one possibility is that the true private school effect operates via the value it adds for students from relatively less well-off backgrounds.

The institutional features associated with school choice are important as well. School choice leads to competition which can manifest itself in schools firing ineffective teachers for instance; or through schools using achievement data to evaluate teachers. School autonomy can also lead to schools taking a more direct role in establishing teachers' salary increases among

other school functions. In addition, parents may be more involved in discussions on budget formulation at the school level. We are able to show that attendance at a private school has a positive and significant effect on cognitive ability, controlling for these factors and even after controlling for selection. In other words, the private school advantage is causal. One reason for the positive effect of private schools in the Netherlands may be due to the value-added to students from less well-off families.

### **CONCLUSIONS**

School choice is often promoted as a means of increasing competition in the school system. It is believed that competition will lead to efficiency gains as schools – public and private – compete for students and try to improve quality while reducing expenses. By encouraging more private schools, vouchers will allow school managers to become innovative and thereby bring improvements to the learning process. Public schools, in order to attract the resources that come with students, will need to improve. Thus, school choice will lead to improved learning outcomes and increased efficiency. Opponents claim that under a voucher system private providers will be unaccountable to tax payers and the public. Claims of efficiency gains are also questioned. Further, opponents sometimes claim that choice will lead to privatization, less public (government) control of education, and increased segregation.

One of the key features of the Dutch education system is freedom of education – freedom to establish schools, determine the principles on which the school is based, and organize classroom teaching. School choice is made possible through public finance, making it the oldest publicly financed school choice system in the world. The Dutch version of freedom of education allows parents the opportunity to choose schools, to establish schools, and to organize teaching

and to determine the principles of the school. This has resulted in a large number of non-public schools financed by the state. Moreover, parents can typically choose among several schools. Parents have access to a variety of schools, access is not selective, all schools are equally publicly financed, there is ease of entry of providers into the market, and information flows. Most children in the Netherlands attend privately-managed schools and the. Private schools are not for profit and usually managed by a foundation or church.

Studies of the effectiveness of school choice programs suffer from an inability to control for selection and are usually not able to attribute outcomes to the type of school attended. Since most schools in the Netherlands are private and we know that religion is a key factor associated with parental choice of school, we use this fact to create an instrument by which to measure the effectiveness of private schools in the Netherlands.

We are able to show that private schools have a positive and significant impact on school outcomes using the OECD's Program for International Student Assessment (PISA) 2006 data for the Netherlands. Only when we property account for selection do we show a positive and significant impact. In fact, OLS estimates show a negligible or insignificant effect of private schools. The IV results show that private school attendance is associated with higher test scores. The true effect of private schools is higher than in the base (OLS) equation. The effect size is higher and the private school variable becomes positive and significant in the case of science as well. Private school size effects in math, reading and science achievement are 0.17, 0.28 and 0.18, all significant. Given PISA's scaling, this is close to 0.2 of a standard deviation in the case of math and science, and almost 0.3 of a standard deviation in reading. In other words, these are large effect size effects, indicating that school choice contributes to achievement in Netherlands. The reasons for an impact, despite the almost equal raw scores in achievement between public

and private schools and almost 100 years existence of a system of public finance of private school choice, might have to do with the fact that it is the relatively less well-off that attend private schools in the Netherlands. That is, the mothers of private school students are slightly less well educated than the mothers of students in public schools. Therefore, one possibility is that the true private school effect operates via the value it adds for students from relatively less well-off backgrounds.

This study has contributed to the small but growing international literature on the effectiveness of school choice. It was shown that private school choice can have an impact, while at the same time contributing to overall high levels of achievement and equity. Also, the Dutch education system exhibits a strong central education policy role but decentralized school management. While private schools have a positive impact, public schools also perform very well and all schools are associated with high levels of autonomy – for example, ability to fire teachers, setting of teacher salary increases, using achievement data, allowing parental participation – at the school level. Thus, central government control and school choice in a predominantly private schooling environment is possible, and evidently beneficial in terms of academic achievement. Dutch students perform exceptionally well on international academic achievement tests, whether they are enrolled in public or private schools. Thus, a large school choice system can promote efficiency and equity without necessarily leading to privatization or to reduced public scrutiny – school choice led to heightened demands for information, prompting the education Inspectorate to promote the use of school report cards and wide dissemination of school results.

The Netherlands shows that a large private sector with equal public funding does not necessarily mean decentralization and a weak central role. Choice can coexist with a strong

center. Interestingly, as the center has moved away from any direct provision of education services its role in policy making, evaluation, and information dissemination increased. Therefore, the fear of the retreat of the state from matters of importance in education policy with the introduction of market forces is not founded.

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**Table 1: PISA 2006 Reasults** 

Math			Science		Reading	
1	Finland	548	Finland	563	Korea	556
2	Hong Kong	547	Hong Kong	542	Finland	547
3	Korea	547	Canada	534	Hong Kong	536
4	Netherlands	531	Estonia	531	Canada	527
5	Switzerland	530	Japan	531	New Zealand	521
6	Canada	527	New Zealand	530	Ireland	517
7	Macao, China	525	Australia	527	Australia	513
8	Liechtenstein	525	Netherlands	525	Liechtenstein	510
9	Japan	523	Liechtenstein	522	Poland	508
10	New Zealand	522	Korea	522	Sweden	507
11	Belgium	520	Slovenia	519	Netherlands	507

Source: OECD 2007

**Table 2: Descriptive Statistics** 

-		Total		Pri	Private		Public	
		Mean	SD	Mean	SD	Mean	SD	
School can fire teachers		0.994	(0.080)	1.000	(0.000)	0.979	(0.143)	
Achievement data us	ed	0.752	(0.432)	0.750	(0.433)	0.756	(0.430)	
Set teacher salary inc	crease	0.809	(0.393)	0.771	(0.420)	0.894	(0.308)	
Parents involved in b	udget	0.088	(0.284)	0.071	(0.257)	0.128	(0.334)	
Religion used to sele	ct school	0.401	(0.490)	0.536	(0.499)	0.092	(0.290)	
Student-teacher ratio		16.325	(4.204)	16.227	(4.584)	16.546	(3.162)	
Math class hours		2.888	(1.433)	2.886	(1.444)	2.894	(1.408)	
Teachers certified		0.884	(0.191)	0.877	(0.176)	0.900	(0.221)	
School location rural		0.026	(0.158)	0.028	(0.164)	0.021	(0.145)	
Student Grade	9th	0.430	(0.495)	0.433	(0.496)	0.423	(0.494)	
	10th	0.529	(0.499)	0.534	(0.499)	0.517	(0.500)	
	11th	0.006	(0.075)	0.004	(0.065)	0.009	(0.094)	
Age		15.718	(0.285)	15.718	(0.284)	15.717	(0.288)	
Female		0.498	(0.500)	0.499	(0.500)	0.494	(0.500)	
Mother's education	Primary	0.051	(0.220)	0.050	(0.218)	0.053	(0.223)	
Lower	secondary	0.128	(0.334)	0.127	(0.333)	0.131	(0.337)	
Upper secondary		0.518	(0.500)	0.547	(0.498)	0.454	(0.498)	
	University	0.284	(0.451)	0.261	(0.439)	0.334	(0.472)	
Books at home	11-100	0.423	(0.494)	0.425	(0.494)	0.419	(0.494)	
	101-500	0.456	(0.498)	0.453	(0.497)	0.464	(0.499)	
One or more computer at home		0.994	(0.074)	0.996	(0.064)	0.991	(0.092)	
N		3,8	340	2,6	565	1,1	175	

Source: PISA 2006

**Table 3: Determinants of Learning: GLS** 

	Math			Reading	Science	
Private school attendance	4.7	(2.2)*	4.0	(2.41)***	-1.0	(2.32)
Institutional variables:						
School can fire teachers	43.3	(12.4)*	19.9	(13.87)	72.5	(13.47)*
Achievement data used	8.3	(2.3)*	10.6	(2.55)*	6.8	(2.44)*
School sets teacher increase	8.1	(2.5)*	9.9	(2.83)*	7.6	(2.70)*
Parents involved in budget	11.4	(3.5)*	16.0	(3.84)*	13.9	(3.83)*
School variables:						
Student-teacher ratio	4.5	(0.2)*	4.3	(0.27)*	4.5	(0.26)*
Class hours	9.3	(0.7)*	1.2	(0.89)	13.7	(0.58)*
Certified teachers	-8.5	(5.2)	7.7	(5.75)	4.7	(5.57)
Rural	-13.6	(6.3)*	-7.6	(6.92)	-19.2	(6.85)*
Student's grade:						
9	43.4	(5.4)*	59.9	(6.03)*	41.8	(5.77)*
10	102.2	(5.6)*	111.9	(6.23)*	97.4	(5.96)*
11	180.1	(14.3)*	185.1	(16.23)*	163.7	(15.35)*
Student's age	-31.4	(3.9)*	-27.3	(4.38)*	-23.1	(4.21)*
Female	-20.8	(2.0)*	13.1	(2.19)*	-16.9	(2.11)*
Mother's education:						
Primary	27.3	(8.3)*	19.1	(9.30)**	23.8	(9.01)*
Lower secondary	27.7	(7.6)*	19.2	(8.50)*	31.1	(8.28)*
Upper secondary	24.8	(7.3)*	25.1	(8.13)*	34.3	(7.94)*
University	42.3	(7.5)*	39.7	(8.34)*	47.5	(8.13)*
Books at home:						
11–100	26.0	(3.2)*	25.2	(3.60)*	27.5	(3.47)*
101-500	58.7	(3.4)*	54.3	(3.72)*	59.4	(3.61)*
Computer(s) at home	36.8	(13.3)*	29.4	(14.81)**	45.0	(13.71)*
Constant	723.5	(66.7)*	652.3	(73.12)*	528.9	(70.41)*
N (students)	3,866		3,891		3,737	
R-square	0.446		0.349		0.476	
Source: Estimation with GLS from PISA 2006						
Notes: Standard errors in parentheses; indicates significances at * 1%, ** 5%, *** 10%						

**Table 4: IV Estimation of Determinants of Learning, Netherlands** 

Table 4: 1V Estimation of Determinants of Learning, Netherlands						
		Math	Reading		Science	
Private	17.4	(5.4)*	28.3	(5.8)*	17.9	(6.0)*
School can fire teachers	34.7	(12.9)*	2.5	(14.3)	48.0	(14.3)*
Achievement data used	8.3	(2.3)*	10.0	(2.6)*	7.1	(2.6)
Schools set teacher increase	9.1	(2.7)*	12.1	(3.0)*	10.3	(3.0)*
Parents involved in budget	13.1	(3.6)*	21.0	(4.0)*	18.4	(4.0)*
Student-teacher ratio	4.5	$(0.2)^*$	4.2	(0.3)*	5.2	(0.3)*
Class hours	9.3	(0.7)*	8.4	(0.8)*	9.2	(0.8)*
Certified teachers	-6.6	(5.2)	11.4	(5.8)	10.6	(5.8)
Rural	-14.1	(6.4)*	-10.2	(7.0)	-24.0	(7.0)*
Student's grade:						
9	42.2	(5.5)*	56.9	(6.1)*	41.9	(6.1)*
10	101.1	(5.7)*	107.6	(6.3)*	94.6	(6.3)*
11	180.5	(14.4)*	176.7	(15.9)*	166.1	(15.9)*
Age	-31.2	(4.0)*	-24.6	(4.4)*	-22.2	(4.4)*
Female	-20.8	(2.0)*	15.2	(2.2)*	-15.8	(2.2)*
Mother's education:						
Primary	26.3	(8.4)*	15.8	(9.3)*	24.3	(9.3)*
Lower secondary	26.4	(7.7)*	16.1	(8.5)*	31.7	(8.5)*
Upper secondary	23.0	(7.4)*	19.6	(8.2)*	31.3	(8.2)*
University	41.8	(7.6)*	36.6	(8.4)*	51.2	(8.4)*
Books at home:		, ,		, ,		. ,
11–100	25.9	(3.3)*	22.5	(3.6)*	31.5	(3.6)*
101-500	58.7	(3.4)*	50.7	(3.8)*	67.3	(3.7)*
Computer(s) at home	34.3	(13.4)*	26.9	(14.8)*	48.1	(14.8)*
Constant	718.2	(66.3)*	593.8	(73.4)*	504.1	(73.3)*
N	3,840	` /	3,840	,	3,840	` '
$R^2$	0.442	2	0.352		0.415	
Over-identification test		identified		identified		identified
G. C. L. C. Dig. 2006						

Source: Computed from PISA 2006 Notes: Standard errors in parentheses







