Sex, Drugs, and Catholic Schools: Private Schooling and Non-Market Adolescent Behaviors

David Figlio
Northwestern University

Jens Ludwig
University of Chicago

Abstract. This study examines the effects of private schooling on adolescent nonmarket behaviors. We control for differences between private and public school students by making use of the rich set of covariates available with our NELS micro-dataset. We also employ an instrumental-variables strategy that exploits variation across metropolitan areas in the costs that parents face in transporting their children to private schools, which stem from differences in the quality of the local transportation infrastructure. We find evidence to suggest that religious private schooling reduces involvement in the most consequential risky behaviors such as teen sexual activity, arrests, and use of hard drugs (cocaine), but not drinking, smoking and marijuana use.

JEL classification: *I-*2.

Keywords: Private schooling; delinquency; crime.

1. INTRODUCTION

Education is widely recognized as a key to a nation's economic growth, and relevant to efforts to address inequality in earnings and other key life outcomes. Dissatisfaction in many developed nations with the performance of public schooling systems has led to debates about whether government should be involved in the financing but not direct provision of elementary and secondary schooling – that is, whether the provision of schooling should be privatized. The degree to which governments currently support private schools varies greatly, with countries like Germany, France and Spain providing substantial support to private schools, while countries like the United States provide relatively little support (Kober, 1999). The situation in the United States is complicated by the fact that a large share of all private schools are provided by Catholic churches and other organizations, while the country has a longstanding tradition of separation of church and state activities.

Debates about the potential privatization of elementary and secondary schooling hinge in part on questions of whether private schools are on average more effective than public schools, and the nature of this relative effectiveness. To date, research has focused almost exclusively on public-private differences in *academic* outcomes. The best available evidence seems to suggest that after accounting for the characteristics of individual students themselves, existing

private schools may on average produce slightly higher test scores and high school completion rates than public schools as currently constituted, at least among certain subgroups (Dronkers and Robert, 2008; Evans and Schwab, 1995; Figlio and Stone, 2000; Goldhaber, 1996; Ludwig, 1997; Neal, 1997; Rouse, 1998).

Yet academic achievement is only one 'output' from the educational process, and in fact many parents reportedly send their children to private schools largely to improve social rather than academic outcomes. Many policymakers also apparently believe that private schools are more effective in socializing students, as evidenced by suggestions that public schools adopt many of the practices used by private schools. For example, an influential member of the House Judiciary Subcommittee on Crime in the United States has argued that public schools should display the Ten Commandments to reduce school shootings and other forms of delinquency. Yet despite the substantial interest in the effects of private schools on nonmarket behaviors, aside from Dee's (2005) study of the effects of Catholic schools on civic participation there is very little systematic evidence currently available on this point. In particular remarkably little is known about impacts on crime, which in developed countries imposes social costs that may be on the order of 10% of GDP (Anderson, 1999; Entorf and Spengler, 2002; Ludwig, 2006).

The present study examines the effects of private religious schooling on crime and other adolescent nonmarket outcomes using micro-data from the National Education Longitudinal Survey (NELS) of 1988, a longitudinal youth survey that focuses on education issues but also includes information about risky teen behaviors. We restrict our attention to religious schools because they constitute the large majority of all private schools in the United States, and public subsidies to such schools are at the heart of debates about school choice in many countries. The non-market behaviors of interest in our analysis include arrests, gang involvement, sexual activity and teenage fecundity, and the use of controlled substances such as tobacco, alcohol, marijuana and cocaine. Each of these behaviors impose substantial costs on society, and may

- 1. Indeed a growing body of research on public school choice programs, which often use lotteries to allocate scarce seats in public schools of choice, find that attending a higher-quality public school has more pronounced impacts on behavioral outcomes like schooling attainment and delinquency than on academic achievement in terms of test scores; see, for example, Cullen *et al.* (2006), Deming (forthcoming) and Deming *et al.* (2012).
- 2. Frank Bruni, House Democrats Push Stricter Gun Rules, The *New York Times*, Friday, May 28, 1999,p. A17.
- 3. Two previous studies that have examined private-school effects on non-market outcomes using data for selected samples of adults. Greene *et al.* (1999) use data from a national survey of Latino adults to examine the effects of prior private-school attendance on political activity and tolerance. Wolf *et al.* (2001) examine the difference in civic values and political tolerance between private and public college students in a sample drawn from four colleges in Texas. In the most closely related work to ours, Mocan and Tekin (2006), in an article that heavily references the initial version of this article, use propensity score matching techniques to study the effects of Catholic schooling on student behavior.

also depress long-term labor market and health outcomes for the teens themselves.⁴

The central challenge in estimating the effects of private schools is to control for unmeasured variables that may be correlated with both student behavior and the family's choice of school sector. The direction of bias introduced by such variables is difficult to predict. On the one hand, parents who are unusually engaged with their children's education may be more likely to pay the additional out-of-pocket expenses required for private schooling, in which case unmeasured family variables may lead to upward bias in positive outcomes (or downward bias in terms of delinquency measures). On the other hand, parents may be more likely to move disruptive children to private schools, in which case unobservables produce the opposite bias.

We address the selection-bias problem in two ways. First, the NELS micro-data used in our analysis provides unusually detailed information about individual students, families and schools. Important family background variables are reported directly by the parents rather than taken from student reports, an important advantage over many of the other datasets that have been used to study private-school effects. Our rich set of controls for student and family backgrounds, including detailed measures of student substance use, misbehavior and sexual activity in the past, should help narrow the scope of omitted variables problems.

Second, we use instrumental-variables (IV) methods to directly control for the possibility of unmeasured variables. Our instruments exploit variation across metropolitan areas in the effective price that parents face in transporting their children to private rather than public schools. Although most public schools in the United States provide some assistance with transportation, in many areas the parents of private-school students are responsible for getting their children to and from school. Our identification strategy exploits the fact that metropolitan areas vary substantially with respect to the quality of the local public transportation infrastructure, and in particular the quality of the subway and other rail systems. Our instruments consist of interactions between measures of the local railway infrastructure and indicators of family socio-economic status (SES), which are negatively correlated with a household's demand for public transportation. The intuition behind our approach is that low-SES families should be more responsive to the availability of public transportation options than are high-SES families,

4. Our motivation for studying adolescent criminal behavior stems from the enormous costs that crime imposes on American society. Interest in teen use of drugs and alcohol is motivated in part by evidence of a strong correlation with adult consumption, due in part perhaps to habit formation (Cook and Moore, 2000; Gruber, 2001; Gruber and Koszegi, 2001). Smoking has negative effects on health and imposes external costs on the rest of society (Manning *et al.*, 1991), while heavy drinking elevates the risk of fatal motor vehicle accidents and interpersonal violence (Markowitz and Grossman, 1996; Cook and Moore, 2000; Levitt and Porter, 2001a; b). Chronic marijuana use elevates the risk of cancer and bronchitis (Caplan and Brigham, 1990; Leuchtenberger, 1983; Newcombe and Bentler, 1988; Tashkin *et al.*, 1987), impairs cognition and learning (Pope and Yurgelun-Todd, 1996), and may serve as a 'gateway' to the use of more dangerous and addictive substances such as cocaine and heroin (Kenkel *et al.*, 2001). Unprotected sex may lead to sexually transmitted diseases (including, in rare cases, Human Immunodeficiency Virus infection); unwanted pregnancy may also result, which in turn may depress schooling outcomes and reduce labor supply and earnings, at least in the short term (Geronimus and Korenman, 1992; Hotz *et al.*, 2005; Klepinger *et al.*, 1999).

who in most areas would probably have private transportation options available to them and so would be largely unaffected by public transportation quality in their private-public school attendance decisions. The identification approach thus exploits the fact that the difference in private-school attendance rates between high- and low-SES families should be more modest in areas with high-quality public transportation. Yet, it seems unlikely that the difference in risky behavior between high- and low- SES families should vary systematically with local transportation characteristics after conditioning on the school sector of attendance.

We find evidence to suggest that private religious schools reduce teen involvement in the most consequential forms of teen risky or anti-social behavior such as sexual activity, arrests, and use of hard drugs (cocaine). On the other hand, we find no evidence for private-school effects on the use of other substances the use of which is more common, and may be perceived to be less consequential (alcohol, tobacco, or marijuana). We also find evidence of a process of 'negative selection', in which parents whose teens are at highest risk for problem behaviors are more likely to send them to private religious schools. Unlike previous studies of academic outcomes, which find that private-school effects are concentrated primarily among urban students (Grogger and Neal, 2000; Neal, 1997), the effects of religious private schools on non-academic outcomes are found primarily with suburban students and those residing in a household with two parents or guardians. Since our outcome variables come from student self-reports, there remains the possibility that these findings simply reflect differences in the propensity of students to report illegal or sensitive behaviors. Yet, when we re-estimate our findings using only those students who appeared to report truthfully about their high school grades (determined by comparing self-reported grades with high school transcript data), our results are qualitatively similar.

The remainder of the paper is organized as follows. The next section discusses previous evidence on differences across school sectors that may be relevant for non-market behaviors.

The third section discusses the NELS data, the fourth reviews our empirical strategy, the fifth section presents our empirical findings, and the sixth section concludes.

2. SOCIALIZATION AND DISCIPLINE ACROSS SCHOOL SECTORS

The belief that religious private schools may be more effective than public schools in socializing students stems in part from documented differences in school practices. Coleman *et al.* (1982) report that the proportion of students in Catholic schools who report that their school is 'excellent' or 'good' in effectiveness of discipline is substantially higher than what is reported by public school students (72% versus 42%); similar differences are observed in student reports of the fairness of discipline (46% versus 36%). Enhanced supervision and discipline may deter misbehavior at school by increasing the probability of punishment for infractions on school grounds, and in fact the proportion of students and

5. In the United States, low-SES families are more heavy users of public transportation than are high-SES families. See, for example, Glaeser and Kahn (2008).

administrators who report student-behavior problems in the schools is far lower in the private than public sector (Bryk *et al.*, 1993; Coleman *et al.*, 1982). Changes in behavior at school could spill over to non-school hours if misbehavior is habituating, or if there are complementarities in the production of in- and out-of-school misbehavior.⁶

A very different mechanism is suggested by the possibility that students may compete for prestige by acting rebellious.⁷ Catholic schools not only have more effective discipline, but many also have regulations regarding such mundane matters as the student's manner of dress. Strict rules about trivial behaviors may enable students to signal that they are rebellious at the cost of relatively minor infractions of school rules. In contrast, students who wish to identify themselves as 'misbehavers' in public schools must resort to more serious activities than wearing white socks with their dark pants and dress shoes.

Although there has been a change in recent years in the way that Catholic schools provide religious instruction, such as an increase in the proportion of religion classes taught by lay faculty, such courses nevertheless remain an important part of the curriculum in most Catholic schools (Bryk *et al.*, 1993). Such instruction could affect student's 'tastes' for misbehavior, or increase the perceived costs of misbehavior by defining a number of activities as sins that have eternal consequences. Previous studies have found some evidence that Catholic schools increase civic engagement (Dee, 2005), and that religious participation more generally might change behavior (Gerber *et al.*, 2010; Hungerman, 2010).

Students in Catholic schools also spend more time on homework and extracurricular activities than those in public schools (Coleman *et al.*, 1982; Figlio and Stone, 2000). Private schools may thus reduce delinquency if only because of an 'incapacitation effect' – teens who are doing homework or running track are not out looking for trouble.

Finally, private schools may indirectly reduce teen problem behavior by exposing them to more pro-social peer groups, or by improving students' academic achievement. The first possibility is suggested by the fact that private schools have a greater ability than public schools to select and expel students, and may thus be less susceptible to 'epidemics' of problem behaviors.⁸ Private schools may also increase the opportunity costs of engaging in problem behaviors by improving academic achievement and consequently future labor market outcomes (Freeman, 1995; Murnane *et al.*, 2000), consistent with evidence that increased schooling attainment reduces criminal involvement (Lochner and Moretti, 2004; Machin *et al.*, 2011, 2012).

- 6. For example, some out-of-school fights may be in retaliation for earlier arguments or fights that occurred at school. It is also possible that schools are an important distribution center for acquiring illegal drugs or weapons.
- 7. This is similar to the argument that many goods are allocated through non-market mechanisms, and as a result prestige and relative standing may matter to individuals (Cole *et al.*, 1992). The same argument may apply to the behavior of high school students most delinquency (at least serious delinquency) is committed by boys, and for those who are not star athletes, misbehavior may be a viable way to compete for non-market 'goods' (in this case, girls).
- 8. Some evidence about the potential importance of peer effects comes from findings that moving from a high- to lower-poverty area, or to a 'higher-quality' public school, generate sizable reductions in criminal involvement (Cullen *et al.*, 2006; Deming, forthcoming; Kling *et al.*, 2005; Ludwig and Kling, 2007).

3. DATA

We begin by discussing the NELS data, and then review our delinquency measures and control variables.

3.1. NELS

The National Education Longitudinal Study (NELS) of 1988, sponsored by the US Department of Education, surveyed a nationally representative sample of eighth-grade students in 1988, with follow-up interviews in 1990 and 1992. The original sample employed a two-stage sampling design, with 1,052 schools selected in the first stage and 26 students per school selected in the second. In our single-equation estimates we calculate Huber-White standard errors to adjust for the clustering of students in schools; as discussed below, since our instruments vary at the level of the metropolitan area a slightly different adjustment is required for our IV estimates.

Base year participants were selected to participate in follow-up surveys in part on the basis of the number of other base year NELS participants in the student's school at the time; dropouts were also retained in the sampling frame (U.S. Department of Education, 1994). Our final sample size is approximately 10,500 (this number varies a bit by dependent variable) out of the 27,805 initial observations in the NELS. A total of 10,412 observations are lost because the students are not surveyed in follow-up waves; most of these students are not interviewed because they were not included in the NELS follow-up sampling frame. We intentionally exclude the 4,982 students who live outside of metropolitan areas in 1990 (for whom we cannot construct our instruments), as well as the 802 students who are in non-religious private schools during the first follow-up. We lose 226 of the remaining observations because we are missing our instrumental variables (because we observe our instruments for most, but not all, metropolitan areas.) The remaining observation losses are due to a missing dependent variable or covariate.

The Department of Education provides weighting variables that account for the probability of participation in the base year and follow-up surveys, as well as school administrator and student survey non-response (U.S. Department of Education, 1994). Our descriptive tabulations are all calculated using these weights. Although our preferred multivariate regression results are run without these weights (to improve the efficiency of our estimates), as shown below, the point estimates from the weighted and unweighted IV analyses tell a qualitatively similar story.

- 9. Excluded from the NELS sample in 1988 were students with mental handicaps, physical or emotional problems, and inadequate command of the English language. In most cases, 24 of the 26 students per school included in NELS were randomly sampled, while the other two students were selected from among the Hispanic and Asian Islander students (U.S. Department of Education, 1994).
- 10. Although follow-up achievement test data are missing for a large proportion of students who have dropped out due to the heavy reliance on telephone surveying for this population (U.S. Department of Education, 1994; Grogger and Neal, 2000), this will have no effect on our analysis because all of our outcome measures come from the survey questionnaires.

For our purposes, the NELS data offer at least five advantages over previous youth surveys: a large sample; data on key aspects of family's socioeconomic status taken from parent (rather than student) surveys; data on school and student-body characteristics taken from school administrators; the measurement of teen non-market outcomes at multiple points in time, which enables us to condition on previous misbehavior; and the retention of dropouts in the sampling frame. We pool information from the student and dropout data to calculate all of our estimates.

3.2. Delinquency measures

Our empirical analysis focuses on several different dichotomous dependent variables designed to measure whether the the respondent was involved in a particular delinquent behavior measured at the time of the second follow-up survey in 1992, when most respondents were around age 18. These variables are derived from NELS participant responses to self-administered pencil-and-paper questionnaires (U.S. Department of Education, 1994). Although self-administered questionnaires seem to yield somewhat lower estimates for the prevalence of sensitive behaviors than computer-assisted methods (Turner *et al.*, 1998), as shown below it does not appear that misreporting substantially distorts our findings.

The first dependent variable of interest measures involvement with the criminal justice system, equal to 1 if the respondent reported having been arrested during the previous academic term (or their last term in school for dropouts) during the second follow-up. The arrest rates reported by NELS teens are quite similar to those implied by national arrest data. Our other measure of criminal or delinquent behavior is equal to 1 if the respondent reports belonging to a gang at the time of the 1992 interview. Around 3% of NELS respondents report gang membership in 1992, which is fairly consistent with other national estimates. 12

Our second set of outcome variables measure the use of controlled substances. We create four dichotomous indicators equal to 1 if the respondent reports that she smokes at least occasionally at the time of the 1992 survey, or has had alcohol, used marijuana, or used cocaine during the last 12 months. Rates of

- 11. For example, in the first NELS follow-up in 1990 (when most students were 15 or 16), six percent of male students had been arrested during the previous term. By comparison, data from the Federal Bureau of Investigation's Uniform Crime Report system suggest that 10% of teens age 15 and 12% of teens age 16 were arrested during 1990 (Federal Bureau of Investigation, 1991). Since the NELS question covers half a school year, and a fair proportion of juvenile criminal activity may occur over the summer, the NELS results seem reasonable.
- 12. Klein (1995) estimates that there were a total of 9,000 street gangs with 400,000 members in the United States in 1992. By way of comparison, there were around 24 million teenagers (ages 13–19) in the United States in 1992 (U.S. Bureau of the Census, 1994); if we assume that gang membership is restricted to teenagers, this implies a gang membership rate of nearly 2%. The discrepancy between the NELS and the Klein estimates could be explained if the rate of gang membership is somewhat higher for older than younger teenagers, or because Klein uses a very specific definition of gangs that excludes among other things 'generally non-violent cohorts such as stoners, tagger crews, and "normal" adolescent peer groups that do on occasion get themselves into illegal patterns of activity' (Klein, 1995, p. 218).

self-reported drug use in the NELS are quite consistent with those reported in other surveys of American adolescents. 13

Finally, we use questions from the third NELS follow-up to measure whether the teen had sex before 1992, and whether the teen had fathered or mothered a child before 1992. 14

3.3. Control variables

Descriptive statistics for selected control variables are presented in Table 1. Our empirical models control for a standard set of family background characteristics obtained from parent self-reports, including mother's and father's educational attainment and family income (all coded as a set of dummy variables to allow for non-linear effects of socioeconomic status on teen behavior), whether the child's father or other adult male guardian is living in the home, the number of children in the family, urbanicity, region, foreign-language status, and a detailed set of indicators for the student's religious affiliation. We also control for a number of student outcomes from eighth grade, including whether the teen smoked or had sex, the frequency with which the teen skipped classes and missed school during the past 4 weeks, got into fights, or was sent to the office. We also control for the teens's performance on standardized reading, mathematics, science and history achievement tests. 16

We do not include controls for the student's 'religiosity', which is typically measured as the frequency with which students attend religious services, because this behavior may itself be a direct outcome of attending religious schools. For example, some religious private schools offer religious services at the school during the school day, and some make attendance at such services mandatory. We also do not include controls for school resources. Although we are interested in both the relative effectiveness and efficiency of private versus public schools, measuring the true value of the inputs used by private and public schools is difficult, particularly with the resource variables available with the NELS.¹⁷

- 13. Data from NELS suggest lifetime prevalence for teens who should be in tenth grade in 1990 of 23% and 4% for marijuana and cocaine use, identical to the results of the first Monitoring the Future survey of tenth graders in 1991 (National Institute on Drug Abuse, Monitoring the Future Study, 1975-1996).
- 14. The third follow-up survey is the first opportunity we have to observe these behaviors. Because of respondent attrition, sample sizes are therefore smaller for these outcomes than for the others. However, the evidence suggests that this is unlikely to bias our results: single-equation estimates for the other outcome variables are qualitatively similar whether or not we exclude those individuals for whom we are missing third follow-up data.
- 15. We include a set of indicators for the following religious groups (Catholic is the omitted group): Baptist; other Protestant; Mormon; Eastern religion; Jewish; Moslem; and no religious affiliation.
- 16. We also include missing-data flags for these variables.
- 17. Measuring the relative efficiency across school sectors is complicated in part by the fact that the NELS only provides measures that approximate per-pupil *instructional* expenditures (such as pupil-teacher ratios and teacher salaries). If private schools devote a larger share of their operating budgets to instructional items, then controlling for instructional spending will understate the relative efficiency of private schools. Another complication is that even total per-pupil expenditures may provide a misleading picture of relative expenditures across school sectors, since many Catholic schools may receive in-kind subsidies from affiliated religious organizations and employees that are not included in traditional school-spending calculations.

Table 1 Selected descriptive statistics for NELS analytic sample

	Base year (1988)	First follow-up (1990)
Male	0.503 (0.006)	
Age as of March, 1992 > 20	0.008 (0.001)	
19	0.073 (0.004)	
18	0.467 (0.007)	
17	0.447 (0.007)	
<16	0.005 (0.001)	
Race/ethnicity African-American	0.129 (0.009)	
Hispanic	0.102 (0.008)	
Asian	0.036 (0.003)	
American Indian	0.040 (0.003)	
Family is Catholic	0.257 (0.010)	
Mother's education less than High School	0.178 (0.007)	
High School	0.250 (0.006)	
Some college	0.409 (0.007)	
College	0.111 (0.005)	
More than college	0.060 (0.004)	
Family income \$0–\$15K	0.202 (0.008)	
\$15K-\$25K	0.174 (0.005)	
\$25K-\$35K	0.188 (0.005)	
\$35K-\$50K	0.208 (0.006)	
\$50K-\$75K	0.153 (0.006)	
\$75Kplus	0.075 (0.005)	
School sector public		0.904 (0.009)
Religious private		0.078 (0.008)
Non-religious private		0.019 (0.003)
Instruments		0.623 (0.015)
Places rated Almanac		
MSA data available for student		
Rail cars per 1,000 population		0.044 (0.004)

Descriptive statistics for NELS respondents, calculated using NELS sampling weights.

4. EMPIRICAL STRATEGY

Our dependent variables, Y_{ij} , are dichotomous indicators for whether adolescent (i) living in metropolitan area (j) has been engaged in a particular criminal or delinquent behavior. We are interested in obtaining consistent estimates for the parameter β_1 in equation (1), which represents the effects of attending a religious private school ($T_{ij}=1$) on the outcomes of interest (This setup can be motivated in the standard way, by assuming Y_{ij} is an indicator for an underlying continuous latent variable within a utility-maximizing framework). The key concern is that since families choose whether to attend private schools, and in fact incur non-trivial marginal costs to opt out of the public school system, school sector may be correlated with unobserved student- or family-level characteristics (equation 2). In this case, estimates of β_1 from a standard probit, logit, or linear probability model may be biased.

$$Y_{ij} = \beta_0 + \beta_1 T_{ij} + \beta_2 X_{ij} + \mu_{ij} \tag{1}$$

$$E[T_{ii}\mu_{ii}] \neq 0 \tag{2}$$

We address this endogeneity problem by using an instrumental-variables strategy that uses variation across areas in the *non-tuition price* of attending private schools due to differences in transportation costs.¹⁸ Although most jurisdictions provide or subsidize the transport of children to public schools, only 11 states subsidize the transportation of students to private schools (Gold *et al.*, 1995). The costs to parents of transporting their children to school in terms of both time and money should thus be a relevant factor in deciding between school sectors.

We exploit the fact that there is variation across metropolitan statistical areas (MSA's) in the quality of the local transportation infrastructure, which will in turn affect the costs to parents of choosing private rather than public schools. Specifically, we exploit variation across MSA's in the quality of the local railway transportation infrastructure, as measured by the number of railcars per capita in the local public transportation system taken from the Places Rated Almanac (PRA). The PRA provides data on public transportation services for each of the Census-designated Standard MSA's in the United States as of 1990, which together capture 62% of the NELS sample given their 1990 (first follow-up) residential addresses. ¹⁹ We exclude from our analytic sample the rural NELS participants who live outside of metropolitan areas. Twenty-two of the 182 MSA's have railway systems, which together account for one-third of the NELS students living within MSA's. There is also considerable variation in the number of railcars per 100,000 MSA residents within those areas that have railway systems, ranging from 0.23 to a high of 35.04.

Our identification strategy also exploits the fact that there is variation in the demand for public transportation across socio-economic strata. On average people seem to value time traveling in a vehicle at 40–50% of their hourly wage, and value travel time outside of a vehicle (which is more common with public transportation modalities than private transportation like automobiles) at around 130% of their wage rate (Small and Winston, 1999). Because travel time is thus more costly for higher-wage adults, and private automobiles typically offer lower travel times than public transportation (particularly for out-of-vehicle time), SES is positively correlated with automobile use and negatively correlated with demand for public transportation. The implication is that a metropolitan area's public transportation infrastructure should have a greater effect on the non-tuition costs

- 18. A number of studies have used students' religious affiliations to identify the effects of private schooling on academic outcomes, motivated by the observation that Catholic students are more likely than others to attend private (particularly Catholic) schools. Yet, there is some evidence to suggest that religion may be correlated with unobserved family attributes that are relevant for academic achievement (Figlio and Stone, 2000; Ludwig, 1997; Murnane *et al.*, 1985; Neal, 1997), and also appears to be correlated with non-market adolescents behaviors, as we demonstrate below. Another possibility is to focus on variation across areas in the tuition price of attending private schools, although as Altonji *et al.* (2005) argue, tuition levels are likely to be correlated with the effectiveness of local private schools.
- 19. We identify the MSAs in which NELS students live on the basis of the geographic location of each student's school. We are able to identify the geographic location of private and public schools in the NELS using a matching crosswalk developed by Figlio and Stone (2000) based on proprietary data purchased from Dun and Bradstreet, as well as telephone conversations with private schools themselves.

of private schooling for the lower-SES families who rely on public transportation the most.

The identification approach can be illustrated by some descriptive calculations using data from the 1990 Census for Miami, Florida. We observe that, conditioning on the income and racial distribution of the Census tract, residents of Census tracts located within one mile of a Miami Metrorail station were over 30% more likely to send their school-aged children to private school than were residents of Census tracts located between one and three miles from a Metrorail station, and over 40% more likely than residents of Census tracts located more than three miles away. Furthermore, this relationship is more pronounced among Census tracts that are disproportionately low-SES or minority-populated.²⁰ The accessibility of public transportation seems to affect decisions about whether to send children to private rather than public schools, particularly for poor and minority families - consistent with the rationales for poverty concentration in cities in the United States documented by Glaeser and Kahn (2008) - which motivates our decision to interact SES with public transportation availability as an instrument in our analysis.

The set of instruments used in our analysis thus includes (in addition to railcars per capita) a series of interactions between the railcar variable and categorical indicators for mother's education and family income. The intuition behind these instruments is that the difference between high- and low-SES families in the probability of attending private schools should be smaller in MSA's with high-quality public transportation systems. Yet, there is little reason to believe that the difference between high- and low-SES families in the propensity of teens to engage in risky or anti-social behaviors should vary systematically with the quality of the local railway system after conditioning on the school sector of attendance.

We use these instruments (Z_{ii}) to estimate the system of equations in (3) and (4) using two-stage least squares (2SLS). One complication comes from the fact that our instruments vary at the level of the metropolitan area rather than the individual, which in turn will lead to downward bias in the standard errors for the second-stage point estimates. We address this problem by estimating Huber-White standard errors in the second stage using the formula shown in equation (5) from Shore-Shepard (1996), where e_{ii} represents the residuals from the second-stage IV regression and Z is the matrix representation of $[X_{ii} \ Z_{ii}]$.

$$C_{ij} = \alpha_0 + \alpha_1 X_{ij} + \alpha_2 Z_{ij} + v_{ij} \tag{3}$$

$$Y_{ij} = \beta_0 + \beta_1 C_{ij} + \beta_2 X_{ij} + e_{ij} \tag{4}$$

$$Var[\beta] = [X'Z(Z'Z)^{-1}Z'X]^{-1}V[X'Z(Z'Z)^{-1}Z'X]$$
(5)

where $V = \sum_j [\sum_i \mu'_{ij} \mu_{ij}]$ and $\mu'_{ij} = e_{ij} (X'Z) (Z'Z)^{-1} Z'_{ij}$ The variation of our instruments at the level of the MSA rather than student also complicates our efforts to test the assumption that the instruments are orthogonal to the second- stage regression residuals. We test this assumption using the generalized method of moments (GMM) over-identification test from Hoxby and Paserman (1998). The GMM over-identification test statistic is calculated as in equation (6), distributed as a chi-squared with degrees of freedom

20. Details on this analysis are available on request from the authors.

equal to the number of exclusion restrictions, where e represents the vector of IV residuals e_{ii} and Z_1 is the matrix version of z_{ii} .

$$Ng'W^{-1}g \rightarrow \chi^2(k) \tag{6}$$

where $W = (1/N) \sum_{j} [(\sum_{i} z_{lij} e_{ij})(\sum_{i} e_{ij} z'_{lij})]$ and $g = Z'_{1}e$

One limitation of our empirical approach is that we wind up with a relatively large number of instrumental variables, many of which have somewhat weak explanatory power in the first stage equation. This can lead the standard errors from two-stage least squares to be too small, leading to over-rejection of the null hypothesis that the endogenous explanatory variable of interest has no relationship to the outcomes of interest in the second-stage equation (see e.g. Murray, 2006). This qualification should be kept in mind when interpreting the results presented below.

5. EMPIRICAL RESULTS

In this section, we present descriptive results from our data and the key IV estimates for the effects of religious private schooling on adolescent non-market outcomes. We then demonstrate that our findings are robust to a number of different modeling assumptions, and conclude by examining the effects on different sub-groups of students.

5.1. Descriptive results

Table 1 presents descriptive statistics for the full sample of students who participated in the 1988 through 1992 waves of NELS, calculated using the second follow-up weights. Around 90% of all students in the sample attended public schools in 1990; another 8% or so attended private religious schools, most of which are Catholic, and another 2% attend nonreligious private schools. We focus on the public and religious private schools.

Table 2 shows that drinking and sexual activity is remarkably common among American 18-year-olds, as is smoking both tobacco and marijuana. Although teen parenthood, arrests, gang membership and cocaine use are less common, it is still the case that a non-trivial share of students engage in these risky behaviors.

The unadjusted differences in the prevalence of these behaviors across school sectors are quite substantial for sexual activity, fecundity and arrests. On the other hand, students in public and religious private schools engage in other risky behaviors at approximately the same rate. Table 2 also shows that the prevalence of risky behaviors for the full sample of students who participate in the 1988 through 1992 waves (top panel) is similar to what is observed among the MSA sample used in our analysis.

21. When observations within MSAs are correlated, the GMM over-identification test from equation (6) produces smaller test statistics than the standard over-identification test described by Hausman (1983) and Newey (1985), in which the second-stage IV residuals are regressed directly against the instruments. In our application the GMM test statistics are typically one-third to two-thirds as large as the standard over-identification test statistics, although in almost every case even the standard over-identification test fails to reject the null hypothesis.

Table 2 Descriptive statistics for delinquency by school sector

	Total	Public school in 1990	Religious private school in 1990
Full sample			
Had sex before 92	0.745 (0.008)	0.756 (0.007)	0.595 (0.033)
Fecundity before 92	0.093 (0.005)	0.092 (0.005)	0.014 (0.005)
Arrested last term	0.043 (0.003)	0.045 (0.003)	0.018 (0.004)
In gang	0.035 (0.003)	0.034 (0.003)	0.036 (0.010)
Smokes	0.258 (0.007)	0.255 (0.007)	0.224 (0.023)
Drank in last year	0.766 (0.007)	0.769 (0.007)	0.759 (0.025)
Smoked marijuana last year	0.196 (0.006)	0.195 (0.007)	0.191 (0.019)
Used cocaine last year	0.026 (0.002)	0.027 (0.002)	0.019 (0.006)
Sample (N)	17,022	15,604	1,418
MSA sample			
Had sex before 92	0.714 (0.011)	0.733 (0.008)	0.572 (0.039)
Fecundity before 92	0.060 (0.004)	0.066 (0.004)	0.010 (0.003)
Arrested last term	0.042 (0.003)	0.044 (0.004)	0.021 (0.005)
In gang	0.033 (0.003)	0.032 (0.003)	0.042 (0.012)
Smokes	0.227 (0.007)	0.228 (0.007)	0.221 (0.024)
Drank in last year	0.776 (0.007)	0.776 (0.007)	0.776 (0.023
Smoked marijuana last year	0.204 (0.008)	0.205 (0.008)	0.201 (0.023)
Used cocaine last year	0.027 (0.002)	0.027 (0.002)	0.022 (0.008)
Sample (N)	10,513	9,346	1,167

Standard errors presented in parentheses, adjusted fort he clustering of NELS students within schools. Estimates are calculated using the NELS sampling weights, with the sample restricted to students enrolled in public or religious private schools in 1990. Sample size refers to the number of teens for whom we have response information for the drug use and arrest variables; the number of cases for which we have valid responses to the sexual behavior items (taken from the third follow-up survey) are typically around 60% as large.

The differences across school sectors in sexual activity, fecundity and arrests generally persist even after we control for detailed family background characteristics, although the magnitudes of these differences are reduced by 50–75% (Table 3).²² We also find that the linear probability model's treatment effects are typically quite similar to the marginal effects implied by the probit regression coefficients. This result is important because it suggests that our instrumental variables models, in which we use a linear 2SLS approach, are not likely to be driven by this choice of model specification.²³ As Grogger and Neal (2000) note, the use of the NELS sampling weights produce slightly larger private-public differences with single-equation methods.

The other relevant finding from the single-equation results summarized in Table 3 concerns the statistically significant effect of student religious affiliation on a number of nonmarket behaviors, even after we have controlled for a

^{22.} These estimates and those that follow are calculated without the NELS sampling weights; a subsequent section discusses the effects of the sampling weights on our estimates.

^{23.} This is unsurprising, given that similar results were found previously by Evans and Schwab (1995) and Figlio and Stone (2000) in the context of academic performance differences between public and private schools.

Table 3 Single-equation estimates

	Unweighted OLS	Probit (dp/dx)	Weighted OLS	Probit (dp/dx)
Had sex before 92	-0.066 (0.023)*	-0.075 (0.026)**	-0.096 (0.026)**	-0.114 (0.031)**
Fecundity before 92	-0.005 (0.005)	-0.009 (0.004)*	-0.018 (0.007)**	-0.013 (0.003)**
Arrested last term	-0.009 (0.006)	-0.005 (0.005)	-0.015 (0.007)**	-0.009 (0.004)*
In gang	0.007 (0.006)	0.008 (0.006)	0.013 (0.012)	0.012 (0.009)
Smokes	0.022 (0.017)	0.025 (0.019)	0.019 (0.022)	0.021 (0.025)
Drank in last year	0.013 (0.017)	0.014 (0.018)	-0.037 (0.022)*	-0.038 (0.023)*
Smoked marijuana last year	0.022 (0.017)	0.015 (0.017)	0.005 (0.020)	0.003 (0.020)
Used cocaine last year	0.001 (0.006)	0.001 (0.005)	0.005 (0.008)	0.002 (0.005)

NELS sample is restricted to those students who participated in each wave of the survey between 1988 and 1992, lived in 1990 within one of the MSAs covered by the Places Rated Almanac, and attend either Catholic or public schools. Standard errors presented in parentheses; estimates are adjusted for clustering of students within schools in the single-equation estimates, and for the clustering of students within MSA's for the IV estimates. Regression models also include controls for student gender, race, age, maternal education, paternal education interacted with whether father or adult male within the home, number of siblings, family income, urbanicity, region, whether foreign language is spoken within the home, religion, and eighth grade outcomes (including standardized test scores in reading, math, history / social studies and science, smoking, problem behaviors in school as reflected by having been sent to the office, fighting, number of classes skipped, and sexual activity). *Statistically significant at the 10% level.

detailed set of family background characteristics and eighth-grade student behaviors. For example, Catholic teens are more likely to drink and have had sex by 1992 than those in other religious groups. The lesson is that while a number of studies have used measures of religious affiliation as instrumental variables in studying the effects of private schools on academic outcomes, religion does not appear to be a valid instrument in our application.²⁴

5.2. Instrumental variables estimates

Our instruments have fairly strong explanatory power in the first-stage model for the decision to attend private religious rather than public schools. For example, Table 4 presents the first-stage coefficients for the instrumental variables using the sample of NELS teens for whom data on sexual activity by 1992 is available. The F-statistic for the joint significance of the instruments is equal to 12.75 (p < .001), which exceeds the cutoff value of 10 suggested by Staiger and Stock (1997).

24. *F*-tests reject the null hypothesis that the religion variables are jointly equal to zero in the single-equation estimates for sexual activity, fecundity, drinking and marijuana use.

^{**}Statistically significant at the 5% level.

Table 4 Selected first-stage results for instrumental variables estimates for the effects of religious private schooling on non-market adolescent outcomes

Explanatory variable	Dependent Variable = Religious private-school attendance in 1990 Beta (SE)
Railcars per 1,000 capita	-56.3 (122.4)
Railcars × Mother more than college	-249.6 (113.2) *
Railcars × Mother college education	-98.4 (84.7)
Railcars × Mother some college	141.5 (106.05)
Railcars × Mother HS education	14.6 (113.5)
Railcars × Mother education missing	797.9 (120.5)*
Railcars × Income \$75Kplus	$-189.2\ (139.0)$
Railcars × Income \$50K–\$75K	-63.8 (86.5)
Railcars × Income \$35K–\$50K	3.4 (84.8)
Railcars × Income \$25K–\$35K	195.3 (140.2)
Railcars × Income \$15K–\$25K	121.1 (59.6)*
Railcars × Income missing	155.2 (104.2)
N	7,300
R^2	0.173
Partial R^2 on instruments	0.012
<i>F</i> -test for significance of instruments	12.75*

The above table presents first-stage results for 2SLS model using an indicator for sexually active by 1992 as the second-stage dependent variable of interest. Standard errors are in parentheses, adjusted for the clustering of NELS students at the MSA level. Analytic sample restricted to students who participated in the NELS survey between 1988 and 1992, and in 1990 were enrolled in either a Catholic or public school and lived within a MSA covered by the Places Rated Almanac (see text). Other variables included in the regression model (see Appendix Table 1) include student sex, age and race, number of siblings, mother's education, father's education interacted with whether father or adult male guardian in the home, family income, urbanicity, region, and eighth grade standardized test scores and behavioral variables.

Table 4 also shows that, as expected, increases in the number of railcars per capita within a MSA increases the probability of private-school attendance for children whose families have low or moderate incomes, and for children whose mothers have lower levels of educational attainment. We also find that improvements in the railway system increase the probability of attending private schools for children for whom maternal education is missing, whom we believe have mothers who are disproportionately likely to have low or moderate levels of schooling.²⁵

25. Some evidence that mothers with low or moderate levels of schooling appear to be less likely to respond to the NELS parent survey (or the parent-survey question about education in particular) comes from our single-equation estimates above. We find that the indicator for mother's-education-missing typically has a coefficient that is more similar in sign and magnitude to the coefficients for maternal education categories below college completion. We also find that in cases where mother's education is missing but family income data are available, 62% report family incomes below \$35,000 per year and fully 80% report annual incomes less than \$50,000. Furthermore, we find that students with missing maternal education report mother's expectations of how ar in school the student will go at about the same rate of students with mothers observed not to have attended any college.

^{*}Statistically significant at the 5% level.

Children of very highly educated mothers appear to be if anything somewhat less likely to attend religious private school when the surrounding MSA has a high-quality railway system. It is possible that higher-SES families are in part opting out of religious private schools when these schools enroll proportionately more lower-SES families, a possibility that we control for by including peer measures in our sensitivity-test section below. When we do this, we observe that our results do not change much, implying that this alternative explanation is not responsible for our findings. Likewise, it is possible that our instruments merely reflect the costs to parents of engaging with their child's school, but, as we report below, our results are virtually unchanged when we control for measures of parental involvement in the school. Another possible explanation is that high-SES families utilize public transportation to send their children to *nonreligious* private schools in metropolitan areas with well-developed railway systems. This possibility is suggested by the fact that 'elite' private schools are disproportionately located in cities, while high-SES families disproportionately live in the suburbs.

When we use instrumental variables in an attempt to overcome the self-selection problem (Table 5), we find even larger effects of religious private schools on adolescent non-market behaviors than those produced by the single-equation estimates. These (unweighted) IV estimates suggests that students in private schools are 24 percentage points less likely to have had sex by 1992 than their public school counterparts, equal to around one-third the fraction of public school students who reported having had sex as of the NELS second follow-up (Table 2).

In fact, the effects of private schooling to depress fecundity, arrests, and cocaine use among teens is even larger than the prevalence of each of these behaviors among public school students (Table 2). Assuming that our instruments are orthogonal to the second-stage residuals, the IV procedure in this case identifies the effects of the private school 'treatment' on those students who are induced to switch school sectors by variation in the instruments (Imbens and Angrist, 1994). Under this 'local average treatment effect' (LATE) interpretation, those students with above-average rates of problem behaviors appear to be more likely to be sent to private schools by their parents when transportation costs are low, and also appear to derive substantial benefits from religious private-school attendance. Put differently, the student on the margin of being sent to private school by their parents seems to be much more likely to engage in delinquency and other anti-social behaviors compared to the average private or public school student. Our findings thus suggest a process of 'negative selection' in which children at greatest risk for problem behavior are provided by parents with the private school treatment. This pattern differs from the usual assumptions about 'positive selection' into private schools.

5.3. Sensitivity analyses

Although we prefer unweighted to weighted IV analysis for reasons of efficiency, Grogger and Neal (2000) argue in favor of weighting. As seen in Table 6, using the NELS sampling weights increases the magnitude (in absolute value) of both the point estimates and the standard errors for the estimated private-school effects on sexual activity, arrests and cocaine use, while the effect on fecundity disappears. Weighting also suggests a positive effect of religious private schooling

Table 5 Instrumental variables estimates for the effects of religious private schooling on non-market adolescent outcomes

	2SLS coefficient for religious private schooling (SE)	GMM overidentification test (<i>p</i> -value)	First stage F-statistic for instruments (p-value)	First stage partial-R ² for instruments	N
Had sex before 92	-0.244 (0.083)**	(0.89)	12.75 (<0.001)	0.012	7,300
Fecundity before 92	-0.073 (0.033)**	(0.52)	11.29 (<0.001)	0.012	7,978
Arrested last term	-0.115 (0.035)**	(0.48)	16.23 (<0.001)	0.011	9,610
In gang	-0.019 (0.028)	(0.52)	13.56 (<0.001)	0.013	8,634
Smokes	-0.032 (0.068)	(0.48)	15.24 (<0.001)	0.012	9,198
Drank in last year	0.028 (0.063)	(0.30)	17.68 (<0.001)	0.012	8,590
Smoked marijuana last year	0.028 (0.078)	(0.46)	18.57 (<0.001)	0.013	8,153
Used cocaine last year	-0.075 (0.026)**	(0.31)	18.40 (<0.001)	0.013	8,140

NELS sample is restricted to those students who participated in each wave of the survey between 1988 and 1992, lived in 1990 within one of the MSAs covered by the Places Rated Almanac, and attend either Catholic or public schools. Standard errors presented in parentheses; estimates are adjusted for clustering of students within schools in the single-equation estimates, and for the clustering of students within MSA's for the IV estimates. Regression models also include controls for student gender, race, age, maternal education, paternal education interacted with whether father or adult male within the home, number of siblings, family income, urbanicity, region, whether foreign language is spoken within the home, religion, and eighth grade test scores and behavioral variables. Instrumental variables are the number of railcars per 1,000 MSA residents, as well as interaction terms between railcars per capita dichotomous indicators for maternal education and family income.

**Statistically significant at the 5% level.

on marijuana use, although this estimate seems to be driven by the relatively small share of NELS participants who receive disproportionately large weights.²⁶ When we set the weights for the bottom and top 5% of the sample equal to the 5th and 95th percentiles of the weight variable, respectively, the marijuana effect essentially disappears. In any case, the bottom line is that the estimated negative effects of religious private schooling on sexual activity, arrests and cocaine use appear to be fairly robust to decisions about whether to use sampling weights.

Table 6 also shows that the IV estimates are robust to whether peer variables are included in the model, which in this case are equal to the proportion of other students in the school who are African-American, Hispanic, or eligible for free- or reduced-price lunch. This finding helps rule out the possibility, raised above, that a peer-attribute story is responsible for our IV results.

26. For example, while the average value of the second follow-up questionnaire weight (f2qwt) is equal to 141.7 in our sample, 5% of the sample has a weight value greater than 353.8 and the top 1% have weights in excess of793.

Lable 6 Sensitivity analyses for instrumental variables estimates

	Weighted	Weighted (trim top and bottom 5% of weight values)	With peer variables included	With parent school involvement included	Include MSA population as a control variable	Delete 'misreporters'
Had sex before 92	-0.440 (0.149)**	-0.323 (0.133)**	-0.283 (0.086)**	-0.250 (0.086)**	-0.249 (0.086)**	-0.201 (0.088)**
Fecundity before 92	0.011 (0.096)	-0.015 (0.053)	-0.061 (0.034)*	-0.054 (0.033)	-0.042 (0.034)	-0.091 (0.037)**
Arrested last	-0.232 (0.073)**	-0.223 (0.062)**	-0.127 (0.034)**	-0.124 (0.034)**	-0.109 (0.033)**	-0.099 (0.038)**
In gang Smokes	-0.137 (0.083) -0.036 (0.094)	-0.077 (0.053) -0.022 (0.087)	-0.031 (0.031) -0.043 (0.073)	-0.030 (0.028) -0.016 (0.069)	-0.054 (0.027)* -0.049 (0.079)	-0.010 (0.029) 0.007 (0.069)
Drank in last year	-0.090 (0.163)	-0.052 (0.102)	0.012 (0.064)	0.037 (0.067)	0.031 (0.059)	0.009 (0.068)
Smoked marijuana last vear	0.240 (0.097)**	0.104 (0.091)	0.021 (0.075)	0.063 (0.080)	0.088 (0.073)	0.066 (0.084)
Used cocaine last year	-0.088 (0.067)	-0.098 (0.055)*	-0.070 (0.026)**	-0.073 (0.027)**	-0.043 (0.034)	-0.073 (0.028)**

NELS sample is restricted to those students who participated in each wave of the survey between 1988 and 1992, lived in 1990 within one of the MSAs scores and behavioral variables. Instrumental variables are the number of railcars per 1,000 MSA residents, as well as interaction terms between railcars models also include controls for student gender, race, age, maternal education, paternal education interacted with whether father or adult male within covered by the Places Rated Almanac, and attend either Catholic or public schools. Standard errors presented in parentheses, estimates are adjusted for clustering of students within schools in the single-equation estimates, and for the clustering of students within MSA's for the IV estimates. Regression the home, number of siblings, family income, urbanicity, region, whether foreign language is spoken within the home, religion, and eighth grade test ber capita dichotomous indicators for maternal education and family income.

Statistically significant at the 10% level. **Statistically significant at the 5% level.

In principle variation in the local transportation infrastructure could have a direct effect on teen outcomes by affecting the involvement of parents in their children's schooling, but Table 6 shows that the results are also robust to the inclusion of variables measuring the frequency with which parents attend PTA meetings and are involved in other ways with parent-teacher organizations. Relatedly, the results are quite similar when we use the railcars per capita variable itself as a control variable rather than as an instrument (so that the only excluded instruments are the interactions between SES and public transportation availability, with the main effects for public transportation availability included as exogenous control variables in both the first and second stage equations). It is also possible that the railway infrastructure variable simply serves as a proxy for MSA size, as railway infrastructure is more prevalent in larger MSAs, but the pattern of results is qualitatively similar when we include MSA population as a control variable.

One final concern with our findings is the possibility that students misreport on their involvement in risky or anti-social behaviors, and that the degree of misreporting may vary across school sectors. To examine the sensitivity of our results to this problem, we replicate our analyses after omitting the students who appear to have substantially misreported their math and English grades when questioned in the NELS survey.²⁷ (Recall that we observe both student-reported data and actual transcript data on grades for NELS students). The results are reported in Table 6, and are quite similar to those obtained using the full sample. Either there is little overlap in the set of students who misreport their grades versus those who misreport involvement in delinquent behaviors, or student misreporting does not substantially distort our findings.²⁸

5.4. Subgroup analyses

Previous research on the effects of private schooling on academic outcomes (Evans and Schwab, 1995; Figlio and Stone, 2000; Grogger and Neal, 2000; Neal, 1997) finds that private school treatment effects are heterogeneous across subgroups. While the present analysis focuses on a considerably different outcome than these previous papers, it is important to gauge the degree to which the results reported above vary across sub-groups. To this end, we report in Table 7 six sets of instrumental variables estimates for males, females, urban residents, suburban residents, students in single-parent households, and students in 2-parent households. The results indicate that there exist considerable differences across groups in the effects of religious schooling. This section describes the principal differences.

We first note that there are substantial differences across the sexes in which outcomes appear to be affected by private religious schooling. Private religious

- 27. Separately for both math and reading grades, we construct a measure of the discrepancy between the student's self-reported math (or reading) grades and those reported on the NELS transcript data file. We then drop those students who are in the top 5% of the distributions for over-stating either their reading or math grades.
- 28. Interestingly enough, single-equation estimates reveal no statistically significant differences between religious private and public school students in the probability of substantially misreporting math or reading grades, although our IV model shows a statistically significant difference of 10 percentage points (with religious private-school students less likely to misreport).

Table 7 Sub-group analyses for instrumental variables estimates

	Males	Females	Urban	Suburban	Students in 1-parent households	Students in 2-parent households
Had sex before 92	-0.081 (0.114)	-0.289 (0.101)**	-0.047 (0.215)	-0.248 (0.085)**	-0.057 (0.094)	-0.310 (0.089)**
Fecundity before 92	-0.038	-0.097 (0.056)*	0.248 (0.077)**	-0.133(0.043)**	0.002 (0.098)	-0.049(0.034)
Arrested last term	-0.207	-0.002(0.024)	0.031 (0.094)	-0.156 (0.038)**	0.004 (0.053)	-0.142 (0.037)**
In gang	0.089(0.054)	-0.024 (0.025)	0.079 (0.108)	-0.014 (0.036)	0.051 (0.064)	-0.036(0.031)
Smokes	-0.191 (0.085)**	-0.021(0.081)	0.166(0.175)	-0.052 (0.079)	0.007 (0.153)	-0.065 (0.070)
Drank in last year	0.012(0.090)	0.017 (0.080)	0.199(0.127)	-0.159 (0.066)**	0.098(0.178)	0.004 (0.072)
Smoked marijuana	-0.011 (0.124)	0.035(0.064)	0.241 (0.219)	-0.032 (0.095)	0.191 (0.203)	-0.003(0.090)
last year						
Used cocaine last	-0.115 (0.044)**	-0.028 (0.023)	0.015 (0.058)	-0.063 (0.035)*	-0.093 (0.068)	-0.065 (0.034)*
year						

models also include controls for student gender, race, age, maternal education, paternal education interacted with whether father or adult male within NELS sample is restricted to those students who participated in each wave of the survey between 1988 and 1992, lived in 1990 within one of the MSAs clustering of students within schools in the single-equation estimates, and for the clustering of students within MSA's for the IV estimates. Regression scores and behavioral variables. Instrumental variables are the number of railcars per 1,000 MSA residents, as well as interaction terms between railcars covered by the Places Rated Almanac, and attend either Catholic or public schools. Standard errors presented in parentheses; estimates are adjusted for the home, number of siblings, family income, urbanicity, region, whether foreign language is spoken within the home, religion, and eighth grade test ber capita dichotomous indicators for maternal education and family income. 'Statistically significant at the 10% level.

**Statistically significant at the 5% level.

schooling is estimated to reduce teenage sexual activity, as well as teenage fecundity, among girls, while these effects are not observed among boys (though both point estimates are negative.) On the other hand, religious private schooling reduces problem behaviors like arrests, smoking and cocaine use only among boys.

Although previous studies find that private schools improve educational outcomes primarily for urban students (Grogger and Neal, 2000; Neal, 1997), our study finds that religious private schooling improves non-market outcomes primarily among suburban students. However, we note that only around one-quarter of our analytic sample is classified as urban under the NELS definition, so the standard errors around the second-stage IV estimates for urban students are fairly large.

Consistent with the finding that religious private schooling primarily affects the nonmarket behaviors of suburban teens, we also find that these effects are concentrated among teens who live in households with two parents or guardians (Table 7). Indeed, in no case do we find evidence of a statistically significant effect of religious private schools for single-parent households, although one effect (a negative effect on cocaine use) approaches statistical significance and has a point estimate larger than its (statistically significant) 2-parent household counterpart.

6. DISCUSSION

It is often perceived that private schools are 'better' than public schools in discouraging delinquent behavior. However, as this is one of the first studies to explore the effects of private schooling on delinquency using a plausibly exogenous source of identifying variation, to date this perception is merely speculation, rather than based on evidence.

Our analysis of data from the NELS finds that religious private schooling seems to produce substantial reductions in teen sexual activity, arrests, and the use of hard drugs (specifically cocaine). These estimates are generally robust to the choice of model specification or use of sampling weights. On the other hand, we do not find consistent evidence that religious private schooling affects teen drinking, marijuana use, gang involvement or smoking. It is also interesting that our findings suggest a process of 'negative selection', in which the parents of those teens at highest risk for involvement in sexual activity or problem behavior are more likely to send their children to religious private schools.

As with any IV analysis, there inevitably remains some question about whether our instruments are truly exogenous. Yet, we produce generally similar findings when we identify our estimates using only the interaction terms between family SES and measures of the local area's public transportation infrastructure. Our use of a rich set of eighth-grade student behavioral outcomes and family background characteristics as controls also helps reduce the scope for omitted variables problems.

The ultimate implications for public policy are difficult to determine. Could public schools reduce teen sexual activity by either including 'character education' as part of the curriculum without reference to specific religious ideologies, or dropping sex and drug education classes? More generally, are there other policies that public schools could adapt from religious private schools that would

improve the academic or non-academic outcomes of students? These are important questions that our study cannot answer.

The implications for school choice programs across developing country contexts are also unclear, since the effects of large- scale choice efforts will depend in large part on the private-school supply response, the relative quality of new entrants into the educational market, the sorting outcomes that would result from large-scale programs with different design features, and the importance of peer effects for academic and non-academic youth outcomes. Although some cautionary evidence on the effects of school choice is now available from New Zealand, which has adopted a national policy of school choice and independent school autonomy (Fiske and Ladd, 2000), more evidence on these points is required within the context of other educational and political systems.

APPENDIX

Table A1 Selected first-stage results for instrumental variables estimates

Explanatory variable	Dependent variable = Religious private-school attendance in 1990 beta (SE)
Male	0.018 (0.012)
Age 20 or older	-0.015 (0.032)
Age 19	-0.032 (0.014)**
Age 18	-0.023 (0.009)**
Age 16 or under	-0.043 (0.046)
Asian	-0.058 (0.022)**
Hispanic	-0.082 (0.021)**
Black	-0.016 (0.020)
American Indian	-0.032 (0.018)*
Language other than English spoken in home	$-0.012 \; (0.013)$
Number of siblings	
1	-0.039 (0.018)**
2	-0.046 (0.019)**
3	-0.031 (0.020)
4	-0.009 (0.022)
5	-0.039 (0.020)*
6+	-0.033~(0.022)
Urban	0.154 (0.029)**
Suburban	0.044 (0.016)**
Northeast	$-0.030 \; (0.031)$
Northcentral	-0.009 (0.034)
South	-0.034~(0.032)
Mother's education	
HS	0.007 (0.009)
Some college	0.018 (0.010)*

Table A1 Continued

	Dependent variable = Religious
Produced to the stable	private-school attendance
Explanatory variable	in 1990 beta (SE)
College	0.043 (0.019)**
College or more	0.059 (0.025)
Missing	-0.00001 (0.025)
Family income	,
\$15K-\$25K	0.009 (0.011)
\$25K-\$35K	0.013 (0.012)
\$35K-\$50K	0.048 (0.015)**
\$50K-\$75K	0.051 (0.018)**
\$75K plus	0.134 (0.036)**
Income missing	0.082 (0.025)**
Religion	(******)
Baptist	-0.180 (0.030)**
Protestant	-0.164 (0.030)**
Mormon	-0.261 (0.033)**
Jewish	-0.118 (0.045)**
Moslem	-0.169 (0.041)**
Eastern-Orthodox	-0.200 (0.038)**
No religious affiliation (atheist)	-0.176 (0.025)**
Father not in home, HS dropout	-0.021 (0.016)
Father in home, HS graduate	0.016 (0.014)
Father not in home, HS graduate	0.009 (0.030)
Father in home, some college	0.007 (0.011)
Father not in home, some college	0.028 (0.036)
Father in home, college graduate	0.033 (0.018)*
Father not in home, college graduate	-0.088 (0.022)**
Father in home, more than college	0.028 (0.018)
Father not in home, more than college	0.167 (0.101)
Father in home, education missing	0.061 (0.018)**
Father not in home, education missing	0.016 (0.010)
Father in home, HS dropout is omitted	, ,
Eighth grade reading scores	0.002 (0.001)**
Eighth grade math scores	-0.0005(0.001)
Eighth grade science scores	-0.003 (0.002)*
Eighth grade history/social studies scores	0.003 (0.002)**
1988 behavioral variables	
Smoke	0.021 (0.014)
Sent to office for misbehavior 1 or 2 times	-0.036 (0.012)**
Sent to office for misbehavior 2+times	-0.076 (0.017)**
Parents warned about behavior 1–2 times	0.028 (0.013)**
Parents warned about behavior 2+times	0.033 (0.021)
Had sex	$-0.022 \ (0.014)$
Got into fight with other student 1–2 times	0.032 (0.014)**
Got into fight with other student 2+times	0.032 (0.019)*
Skip class less than once a week	

Table A1 Continued

Explanatory variable	Dependent variable = Religious private-school attendance in 1990 beta (SE)
Skip class at least once a week	-0.027 (0.029)
Skip class daily	-0.061(0.041)
Missed 1–2 days of school last 4 weeks	-0.018 (0.008)**
Missed 3–4 days of school last 4 weeks	-0.052 (0.012)**
Missed 5–10 days of school last 4 weeks	-0.001(0.014)
Missed 10 or more days of school last 4 weeks	-0.004(0.024)
Instrumental variables	
Railcars per 1,000 capita	-56.3 (122.4)
Railcars × Mother more than college	-249.6 (113.2)**
Railcars × Mother college education	-98.4 (84.7)
Railcars × Mother some college	141.5 (106.1)
Railcars × Mother HS education	14.6 (113.5)
Railcars × Mother education missing	797.9 (120.5)**
Railcars × Income \$75K plus	-189.2 (139.1)
Railcars × Income \$50K–\$75K	-63.8 (86.5)
Railcars × Income \$35K–\$50K	3.4 (84.8)
Railcars × Income \$25K–\$35K	195.3 (140.2)
Railcars × Income \$15K–\$25K	121.1 (59.6)**
Railcars × Income missing	155.2 (104.2)
Constant	0.079 (0.047)*
N	7,300
R^2	0.173

The above table presents first-stage results for 2SLS model using sexual activity in 1992 as the second-stage dependent variable of interest. Standard errors are in parentheses, adjusted for the clustering of NELS students at the MSA level. Analytic sample restricted to students who participated in the NELS survey between 1988 and 1992, and in 1990 were enrolled in either a Catholic or public school and lived within a MSA covered by the Places Rated Almanac (see text). Other variables included in the regression model (results not shown) include missing-data indicators for eighth grade problem behaviors, eighth grade test scores, eighth grade sexual activity, age, race, religion, and number of siblings. *Statistically significant at the 10% level.

^{**}Statistically significant at the 5% level.

 Table A2
 Selected second-stage results for instrumental variables estimates

	Dependent	Dependent	Dependent
	variable:	variable:	variable:
	Had sex	Used cocaine	Arrested last
Explanatory Variable:	before 1992	last year	term
Attend religious private school in 1990	-0.244 (0.083)**	-0.075 (0.026)**	-0.115 (0.035)**
(predicted value)			
Male	0.044 (0.015)**	-0.003 (0.003)	0.031 (0.004)**
Age 20 or older	-0.083 (0.059)	-0.046 (0.012)**	-0.042 (0.024)*
Age 19	0.013 (0.019)	-0.016 (0.009)*	-0.013 (0.010)
Age 18	0.027 (0.010)**	-0.002 (0.005)	-0.007 (0.005)
Age 16 or under	-0.142 (0.082)*	-0.021 (0.007)**	-0.002(0.025)
Asian	-0.131 (0.029)**	-0.006 (0.008)	-0.026 (0.010)**
Hispanic	0.001 (0.022)	-0.0004 (0.008)	-0.020 (0.007)**
Black	0.052 (0.021)**	-0.024 (0.007)**	-0.004 (0.009)
American Indian	-0.020 (0.025)	-0.014 (0.009)	0.005 (0.013)
Other language besides	-0.102 (0.023)**	-0.002 (0.006)	0.008 (0.008)
English spoken in			
home			
Number of siblings			
1	0.004 (0.021)	-0.009 (0.007)	$-0.016 \; (0.011)$
2	$-0.008 \; (0.024)$	$-0.0003 \; (0.007)$	$-0.016 \; (0.011)$
3	-0.007 (0.028)	$-0.002 \ (0.008)$	$-0.011 \ (0.013)$
4	0.005 (0.030)	0.006 (0.010)	-0.007 (0.010)
5	0.003 (0.028)	-0.009 (0.011)	$-0.016 \; (0.017)$
6+	$-0.022 \ (0.029)$	$-0.016 \ (0.010)$	$-0.021 \ (0.013)$
Urban	0.006 (0.028)	0.010 (0.009)	0.015 (0.010)
Suburban	-0.007 (0.020)	0.010 (0.008)	0.004 (0.008)
Northeast	0.013 (0.018)	$-0.004 \ (0.008)$	$-0.006 \; (0.008)$
Northcentral	0.025 (0.021)	-0.009 (0.006)	0.009 (0.008)
South	0.008 (0.019)	-0.008 (0.006)	-0.013 (0.007)*
Mother's education			
HS	-0.013 (0.017)	0.001 (0.008)	-0.002 (0.010)
Some college	0.016 (0.016)	0.007 (0.008)	-0.004 (0.009)
College	-0.043 (0.022)*	-0.004 (0.007)	-0.0002 (0.009)
College or more	-0.040 (0.034)	-0.001 (0.008)	-0.015 (0.008)*
Missing family income	-0.005 (0.026)	-0.0004 (0.010)	0.022 (0.013)*
\$15K-\$25K	-0.008 (0.018)	0.007 (0.007)	0.010 (0.007)
\$25K-\$35K	0.040 (0.021)*	0.007 (0.007)	0.011 (0.007)
\$35K-\$50K	0.016 (0.022)	0.014 (0.007)*	0.016 (0.008)*
\$50K-\$75K	0.051 (0.023)**	0.003 (0.007)	0.020 (0.009)**
\$75K plus	0.082 (0.029)**	0.014 (0.007)**	0.032 (0.010)**
Income missing	0.017 (0.028)	0.023 (0.011)**	$-0.0004 \ (0.010)$
Religion	0.035 (0.034)	0.014 (0.000)++	0.016 (0.000)+
Baptist	-0.035 (0.024)	-0.014 (0.006)**	-0.016 (0.009)*
Protestant	-0.058 (0.020)**	-0.011 (0.005)**	-0.015 (0.008)*
Mormon	-0.236 (0.052)**	$-0.023 \; (0.014)$	-0.027 (0.012)**

Table A2 Continued

Explanatory Variable:	Dependent variable: Had sex before 1992	Dependent variable: Used cocaine last year	Dependent variable: Arrested last term
- Tapianatory variable:		<u> </u>	
Jewish	-0.163 (0.043)**	-0.013 (0.010)	-0.008 (0.014)
Moslem	-0.168 (0.088)*	-0.028 (0.010)**	0.045 (0.045)
Eastern-Orthodox	-0.118 (0.056)**	-0.021 (0.012)*	-0.004 (0.018)
No religious affiliation (atheist)	-0.008 (0.025)	0.002 (0.010)	-0.006 (0.011)
Father not in home, HS dropout	-0.053 (0.064)	-0.032 (0.009)**	-0.00003 (0.028)
Father in home, HS graduate	0.036 (0.017)**	-0.015 (0.009)*	0.006 (0.009)
Father not in home, HS graduate	-0.016 (0.062)	-0.032 (0.010)**	0.017 (0.044)
Father in home, some college	-0.009 (0.016)	-0.009 (0.008)	0.003 (0.008)
Father not in home, some college	-0.031 (0.068)	-0.003 (0.027)	-0.003 (0.020)
Father in home, college graduate	-0.023 (0.024)	-0.006 (0.009)	0.002 (0.009)
Father not in home, college graduate	0.084 (0.077)	0.002 (0.054)	-0.063 (0.014)**
Father in home, more than college	-0.066 (0.026)**	-0.022 (0.008)**	0.003 (0.010)
Father not in home, more than college	-0.246 (0.145)*	-0.008 (0.013)	.067 (0.080)
Father in home, education	missing		
Father not in home, ed missing	-0.007 (0.024)	-0.006 (0.010)	0.020 (0.011)*
Father in home, HS dropout is omitted	0.044 (0.022)**	-0.002 (0.009)	0.001 (0.009)
Eighth grade reading scores	-0.002 (0.001)**	-0.001 (0.0003)*	-0.0001 (0.0004)
Eighth grade math scores	-0.002 (0.001)**	0.0001 (0.0002)	-0.0004 (0.0002)*
Eighth grade science scores	0.001 (0.002)	0.001 (0.001)*	-0.0005 (0.0006)
Eighth grade history / social studies	-0.002 (0.002)	-0.0001 (0.0005)	-0.0003 (0.0007)
Eighth grade behavioral va			
Smoke	0.085 (0.018)**	0.020 (.014)	0.008 (0.012)
Sent to office for	0.064 (0.018)**	0.029 (0.008)**	0.010 (0.007)
misbehavior			
1–2 times			

Table A2 Continued

Explanatory Variable:	Dependent variable: Had sex before 1992	Dependent variable: Used cocaine last year	Dependent variable: Arrested last term
Sent to office for misbehavior 2 + times	0.034 (0.018)*	0.024 (0.012)**	0.015 (0.013)
Parents warned about behavior 1–2	0.047 (0.016)**	0.003 (0.006)	0.028 (0.008)**
Parents warned about behavior 2+	0.035 (0.022)	0.068 (0.019)**	0.056 (0.017)**
Had sex	0.227 (0.011)**	0.017 (0.009)*	0.038 (0.009)**
Got into fight with other student 1–2	0.060 (0.016)**	0.008 (0.007)	0.021 (0.008)*
Got into fight with other student 2+	0.037 (0.019)*	0.006 (0.015)	0.026 (0.017)
Skip class < 1 per week	0.046 (0.021)**	0.031 (0.013)**	0.002 (0.010)
Skip class ≥ 1 per week	0.026 (0.035)	0.015 (0.026)	-0.006 (0.030)
Skip class daily	-0.048 (0.062)	0.016 (0.041)	0.056 (0.050)
Missed 1–2 days school last 4 weeks	0.049 (0.012)**	0.007 (0.004)	0.006 (0.005)
Missed 3–4 days school last 4 weeks	0.044 (0.016)**	-0.001 (0.006)	-0.001 (0.006)
Missed 5–10 days school last 4 weeks	0.014 (0.028)	0.003 (0.010)	0.023 (0.013)*
Missed 10 or more days last 4 weeks	0.028 (0.040)	0.018 (0.022)	-0.004 (0.017)
Constant	0.810 (0.072)**	0.019 (0.019)	0.061 (0.024)**
N	7,300	8,140	9,610
R^2	0.1435	0.0249	0.0280

The above table presents second-stage results for 2SLS model using as instrumental variables railcars per capita, and railcars per capita interacted with indicators for mother's educational attainment and family income. Standard errors are in parentheses, adjusted for the clustering of NELS students at the MSA level. Analytic sample restricted to students who participated in the NELS survey between 1988 and 1992, and in 1990 were enrolled in either a Catholic or public school and lived within a MSA covered by the Places Rated Almanac (see text). Other variables included in the regression model (results not shown) include missing-data indicators for eighth grade problem behaviors, eighth grade test scores, eighth grade sexual activity, age, race, religion and number of siblings.

ACKNOWLEDGEMENTS

This article first appeared as National Bureau of Economic Research Working Paper 7990 in 2000. Thanks to Kevin Donohue and Justin Treloar for excellent

^{*}Statistically significant at the 10% level.

^{**}Statistically significant at the 5% level.

research assistance, and to Charlie Brown, Dan Goldhaber, Jonathan Gruber, Helen Ladd, Derek Neal, Rosalie Pacula, Steve Pischke, Chris Ruhm, Lara Shore-Shepard, Christian Traxler, Patrick Wolf, seminar participants at the Association for Public Policy Analysis and Management and the National Bureau of Economic Research Children's Program, and two anonymous referees for helpful comments. Thanks to the National Science Foundation and the American Education Research Association for financial support. Any errors and all opinions are our own.

Address for correspondence: Jens Ludwig, McCormick Foundation Professor of Social Service Administration, Law, and Public Policy, University of Chicago, Chicago, IL 60637, USA. Tel.: 1-773-834-0811; fax: 1-773-834-1582; e-mail: jludwig@uchicago.edu

REFERENCES

- Altonji, J. G., T. Elder and C. Taber (2005), 'An Evaluation of Instrumental Variable Strategies for Estimating the Effects of Catholic Schooling', *Journal of Human Resources* 40, 791–821.
- Anderson, D. A. (1999), 'The Aggregate Burden of Crime', *Journal of Law and Economics* 42, 611–642.
- Bryk, A. S., V. E. Lee and P. B. Holland (1993), *Catholic Schools and the Common Good*. Harvard University Press, Cambridge, MA.
- Caplan, G. A. and B. A. Brigham (1990), 'Marijuana Smoking and Carcinoma of the Tongue: Is There an Association?' *Cancer* 66, 1005–1006.
- Cole, H. L., G. J. Mailath and A. Postlewaite (1992), 'Social Norms, Savings Behavior, and Growth', *Journal of Political Economy* 100, 1092–1125.
- Coleman, J. S., T. Hoffer and S. Kilgore (1982), High School Achievement: Public, Catholic, and Private Schools Compared. Basic Books, New York.
- Cook, P. J. and M. J. Moore (2000), 'Alcohol', in: A. J. Culyer and J. P. Newhouse (eds.), *Handbook of Health Economics*, Volume 1, Elsevier, Amsterdam, pp. 1629–1673.
- Cullen, J. B., B.A. Jacob and S. Levitt (2006), 'The Effect of School Choice on Student Outcomes: Evidence from Randomized Lotteries', *Econometrica* 74, 1191–1230.
- Dee, T. S. (2005), 'The Effects of Catholic Schooling on Civic Participation', *International Tax and Public Finance* 12, 605–625.
- Deming, D. J. (forthcoming) 'Better Schools, Less Crime', Quarterly Journal of Economics.
- Deming, D. J., J. S. Hastings, T. J. Kane and D. O. Staiger (2012), 'School Choice, School Quality, and Postsecondary Attainment', NBER Working Paper 17438.
- Dronkers, J. and P. Robert (2008), 'Differences in Scholastic Achievement of Public, Private, Government-dependent, and Private Independent Schools: A Cross-national Analysis', *Educational Policy* 22, 541–577.
- Entorf, H. and H. Spengler (2002), Crime in Europe: Causes and Consequences. Springer.
- Evans, W. N. and R. M. Schwab (1995), 'Finishing School and Starting College: Do Catholic Schools Make A Difference?' *Quarterly Journal of Economics* 110, 941–974.
- Federal Bureau of Investigation (1991), *Crime in the United States, 1990.* U.S. Government Printing Office, Washington, DC.
- Figlio, D. N. and J. A. Stone (2000), 'Are Private Schools Really Better?' *Research in Labor Economics* 18, 115–140.
- Fiske, E. B. and H. F. Ladd (2000), When Schools Compete: A Cautionary Tale. Brookings Institution, Washington, DC.

- Freeman, R. B. (1995), 'The Labor Market' in: J. Q. Wilson and J. Petersilia (eds.), *Crime*, Institute for Contemporary Studies Press, San Francisco, CA, pp. 171–192.
- Gerber, A., J. Gruber and D. M. Hungerman (2010), 'Does Church Attendance Cause People to Vote? Using Blue Laws' Repeal to Estimate the Effect of Religiosity on Voter Turnout', NBER Working Paper 14303.
- Geronimus, A. and S. Korenman (1992), 'The Socioeconomic Consequences of Teen Childbearing Reconsidered', *Quarterly Journal of Economics* 107, 1187–1214.
- Glaeser, E. and M. Kahn (2008), 'Why Do the Poor Live in Cities? The Role of Public Transportation', *Journal of Urban Economics* 63, 1–24.
- Gold, S. D., D. M. Smith and S. B. Lawton, (1995), *Public School Finance Programs of the United States and Canada 1993-94, Volumes I and II.* American Education Finance Association, Center for the Study of the States, the Nelson A. Rockefeller Institute of Government and the State University of New York, New York.
- Goldhaber, D. D. (1996), 'Public and Private High Schools: Is School Choice an Answer to the Productivity Problem?' *Economics of Education Review* 15, 93–109.
- Greene, J. P., J. Giammo and N. Mellow (1999), 'The Effect of Private Education on Political Participation, Social Capital and Tolerance: An Examination of the Latino National Political Survey', *Georgetown Public Policy Review* 5, 53–71.
- Grogger, J. and D. Neal (2000), 'Further Evidence on the Effects of Catholic Secondary Schooling', in: W. G. Gale and J. R. Pack (eds.), *Brookings-Wharton Papers on Urban Affairs*, 2000. Brookings, Washington, DC, pp. 151–201.
- Gruber, J. (2001), 'Risky Behavior Among Youths: An Economic Analysis', in: J. Gruber (eds.), *Risky Behavior Among Youth: An Economic Analysis*, University of Chicago Press, Chicago, IL, pp. 1–28.
- Gruber, J. and B. Koszegi (2001), 'Is Addiction 'Rational'? Theory and Evidence', *Quarterly Journal of Economics* 116, 1261–1303.
- Hausman, J. A. (1983), 'Specification and Estimation of Simultaneous Equation Models', in: Z. Griliches and M. Intriligator (eds.), *Handbook of Econometrics*, Volume 1. North Holland, Amsterdam, pp. 391–448.
- Hotz, V. J., S. W. McElroy and S. G. Sanders (2005), 'Teenage Childbearing and Its Life Cycle Consequences: Exploiting a Very Natural Experiment', *Journal of Human Resources* 40, 683–715.
- Hoxby, C. and M.D. Paserman (1998), 'Overidentification Tests with Grouped Data', NBER Technical Working Paper 223.
- Hungerman, D. M. (2010), 'Does Religious Proscription Cause People to Act Differently? Evidence from a Theory-based Test', NBER Working Paper 16973.
- Imbens, G. W. and J. D. Angrist (1994), 'Identification and Estimation ofLocal Average TreatmentEffects', *Econometrica* 62, 467–475.
- Kenkel, D., A. D. Mathios and R. L. Pacula (2001), 'Economics of Youth Drug Use, Addiction and Gateway Effects', *Addiction* 96, 151–164.
- Klein, M. W. (1995), 'Street Gang Cycles', in: J. Q. Wilson and J. Petersilia (eds.), *Crime*, Institute for Contemporary Studies Press, San Francisco, CA, pp. 217–236.
- Klepinger, D., S. Lundberg and R. Plotnick (1999), 'How Does Adolescent Fertility Affect the Human Capital and Wages of Young Women?' *Journal of Human Resources* 34, 421–448.
- Kling, J. R., J. Ludwig and L. F. Katz (2005), 'Neighborhood Effects on Crime for Female and Male Youth: Evidence from a Randomized Housing Voucher Experiment', *Quarterly Journal of Economics* 120, 87–130.
- Kober, N. (1999), Lessons from Other Countries about Private School Aid. Center on Education Policy, Washington, DC.

- Leuchtenberger, C. (1983), 'Effects of Marhuana (Cannabis) Smoke On Cellular Biochemistry of In Vitro Test Systems', In K. O. Fehr and H. Kalant (eds.), *Cannabis and Health Hazards*. Addiction Research Foundation, Toronto, pp. 177–224.
- Levitt, S. D. and J. Porter (2001a), 'Sample selection in the estimation of air bag and seat belt effectiveness', *Review of Economics and Statistics* 83, 603–615.
- Levitt, S. D. and J. Porter (2001b), 'How dangerous are drinking drivers?' *Journal of Political Economy* 109, 379–420.
- Lochner, L. and E. Moretti (2004), 'The Effect of Education on Crime: Evidence from Prison Inmates, Arrests, and Self-Reports', *American Economic Review* 94, 155–189.
- Ludwig, J. (1997), 'Educational Achievement in Public, Private, and Catholic Schools: New Evidence on What We Know (and Don't Know)', Working Paper, Georgetown University.
- Ludwig, J. (2006), 'The Costs of Crime', Testimony to the U.S. Senate Judiciary Committee, September 19, 2006.
- Ludwig, J. and J. Kling (2007), 'Is Crime Contagious?' Journal of Law and Economics 50, 491–518.
- Machin, S., O. Marie and S. Vujić (2011), 'The Crime Reducing Effect of Education', *Economic Journal* 121, 463–484.
- Machin, S., O. Marie and S. Vujić (2012), 'Youth Crime and Education Expansion', *German Economic Review*, in press.
- Manning, W. G., E. B. Keeler, J. P. Newhouse, E. M. Sloss and J. Wasserman (1991), *The Costs of Poor Health Habits*. Harvard University Press, Cambridge, MA.
- Markowitz, S. and M. Grossman (1996), 'Alcohol Regulation and Violence Towards Children', *Contemporary Economic Policy* 16, 309–320.
- Mocan, N. H. and E. Tekin (2006), 'Catholic Schools and Bad Behavior: A Propensity Score Matching Analysis', Contributions to Economic Analysis and Policy 5. Article 13.
- Murnane, R. J., S. Newstead and R. Olsen (1985), 'Comparing Public and Private Schools: The Puzzling Role of Selectivity Bias', *Journal of Business and Economic Statistics* 3, 23–35.
- Murnane, R. J., J. B. Willet, Y. Duhaldeborde and J. H. Tyler (2000), 'How Important Are the Cognitive Skills of Teenagers in Predicting Subsequent Earnings?' *Journal of Policy Analysis and Management* 19, 547–568.
- Murray, M. P. (2006), 'Avoiding Invalid Instruments and Coping with Weak Instruments', *Journal of Economic Perspectives* 20(4), 111–132.
- National Institute on Drug Abuse, Monitoring the Future Study 1975-1996. (Downloaded from the NIDA world wide web site, at ww.nida.nih.gov/NIDACapsules/NCMTFuture. html#Lifetime)
- Neal, D. (1997), 'The Effect of Catholic Secondary Schooling on Educational Attainment', *Journal of Labor Economics* 15, 98–123.
- Newcombe, M. D. and P. Bentler (1988), Consequences of Adolescent Drug Use: Impact on the Lives of Young Adults. Sage Publications, Newbury Park, CA.
- Newey, W. (1985), 'Generalized Method of Moments Specification Testing', *Journal of Econometrics* 29, 229–256.
- Pope, H. G. and D. Yurgelun-Todd (1996), 'The Residual Cognitive Effects of Heavy Marijuana Use in College Students', *Journal of the American Medical Association* 275, 521–527.
- Rouse, C. E. (1998), 'Private School Vouchers and Student Achievement: An Evaluation of the Milwaukee Parental Choice Program', *Quarterly Journal of Economics* 113, 553–602.
- Shore-Shepard, L. (1996), 'The Precision of Instrumental Variables Estimates With Grouped Data', Working Paper 374, Industrial Relations Section, Princeton University.
- Small, K. A. and C. Winston (1999), 'The Demand for Transportation: Models and Applications', in: J. A. Gomez-Ibanez, W. B. Tye and C. Winston (eds.), *Essays in Transportation Economics and Policy: A Handbook in Honor of John R. Meyer*, Brookings Institution, Washington, DC, pp. 11–56.

- Staiger, D. and J. H. Stock (1997), 'Instrumental Variables Regression With Weak Instruments', *Econometrica* 65, 557–586.
- Tashkin, D. P., A. H. Coulson, V. A. Clark, M. Simmons, L. B. Borque, S. Duann *et al.* (1987), 'Respiratory Symptoms and Lung Function in Habitual Heavy Smokers of Marijuana Alone, Smoker of Marijuana and Tobacco, Smokers of Tobacco Alone, and Nonsmokers', *American Review of Respiratory Diseases* 135, 209–216.
- Turner, C. F., L. Ku, F. L. Sonenstein and J. H. Pleck (1998), 'Adolescent Sexual Behavior, Drug Use and Violence: New Survey Technology Detects Elevated Prevalence', *Science* 280, 867–873.
- U.S. Department of Education (1994), National Educational Longitudinal Study at 1988: Second Follow-up: Student Component Data File User's Manual. National Center for Education Statistics, Washington, DC.
- U.S. Bureau of the Census (1994), *Statistical Abstract of the United States: 1994*, 114th Edition. Census Bureau, Washington, DC.
- Wolf, P. J., J. P. Greene, B. Kleitz and K. Thalhammer (2001) 'Private Schooling and Political Tolerance: Evidence from College Students in Texas', in: P. E. Peterson and D. E. Campbell (eds.), *Charters, Vouchers, and Public Education*, Brookings, Washington, DC, pp. 268–289.