

Returns to Investment in Education

A Decennial Review of the Global Literature

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Abstract

Returns to investment in education based on human capital theory have been estimated systematically since the 1950s. In the 60-plus year history of such estimates, there have been several compilations in the literature. This paper reviews and highlights the latest trends and patterns based on a database of 1,120 estimates in 139 countries. The review shows that the private average global rate of return to one extra year of schooling is about 9 percent a year and very stable over decades. Private returns to

higher education have increased over time, raising issues of financing and equity. Social returns to schooling remain high, above 10 percent at the secondary and higher education levels. Women continue to experience higher average rates of return to schooling, showing that girls' education remains a priority. Returns are higher in low-income countries. Those employed in the private sector of the economy enjoy higher returns than those in the public sector, lending support to the productive value of education.

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Returns to Investment in Education: A Decennial Review of the Global Literature

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Introduction

With roots in the writings of classical economists (see, for example, Adam Smith 1776; Marshall 1890) the link between education and earnings only recently emerged. Formal modeling did not take place until much more recently (Schultz 1960, 1961; Becker 1964; Mincer 1974; Chiswick 2003). The study of earnings by schooling has led to several empirical works testing hypotheses on a great variety of social issues. These include, for example, racial and ethnic discrimination, gender discrimination, income distribution, and the determinants of the demand for education. But the dominant application that has used earnings by level of education is the estimation of the rate of return to investment in schooling.

The concept of the rate of return on investment in education is very similar to that for any other investment. It is a summary of the costs and benefits of the investment incurred at different points in time, and it is expressed in an annual (percentage) yield, like that quoted for savings accounts or government bonds. Returns on investment in education based on human capital theory have been estimated since the late 1950s. Human capital theory puts forward the concept that investments in education increase future productivity.

Estimation of the returns to education has been a popular subject in the literature (Ashenfelter and Krueger 1994; Becker 1964; Becker and Chiswick 1966; Card and Krueger 1992; Card 2001; Duflo 2001; Heckman, Lochner and Todd 2006; Oreopoulos 2006; Rosenzweig 1995; Schultz 1961). Since our last review of the literature, contributions on the subject have grown exponentially, to the point of being difficult to track (for previous compilations see Harmon, Oosterbeek and Walker 2003; Psacharopoulos 1972, 1973, 1981, 1985, 1993, 1994; Psacharopoulos and Patrinos 2002, 2004a). There have been several compilations that we have undertaken, including a few encyclopedia articles (Patrinos and Psacharopoulos 2010a, 2010b, 2002; Psacharopoulos and Patrinos 2008, 2004b). There are also a few attempts to create databases of comparable estimates of the return to schooling (Hendricks 2004; Montenegro and Patrinos 2014; Peet, Fink and Fawzi 2015).

The popularity of estimating returns to education stems from the resulting efficiency, equity and financing implications. The rank order of returns to a level or type of education, and a comparison with the returns of alternative investments can assist education policy makers to make informed investment decisions.

Previous compilations have shown that private returns to primary education decline over time, but slightly (Psacharopoulos 1981). Previous work also shows that returns are highest for primary education, the general curricula, the education of women, and countries with the lowest per capita income (Psacharopoulos 1985). Also, primary education continues to exhibit the highest social profitability in all world regions. Social and private returns at all levels generally decline by the level of a country's per capita income. Overall, the returns to female education are higher than those to male education. The returns to the academic secondary school track are higher than the vocational track – since the unit cost of vocational education is much higher; and the returns for those who work in the private (competitive) sector of the economy are higher than in the public (noncompetitive) sector (Psacharopoulos 1994).

The classic pattern of falling returns to education by level of economic development and level of

education is maintained. The private returns to higher education are increasing, highest returns are recorded for low-income and middle-income countries, average returns to schooling are highest in Latin America and the Caribbean (Psacharopoulos and Patrinos 2004a).

In this update we follow the tradition (see, for example, Psacharopoulos and Patrinos 2004) and present the latest estimates and patterns. We review estimates from 139 countries over several years resulting in a panel of 1,120 country-year cases.

Methods

Returns to education in the literature have been estimated using two main methods – the full-discounting method and the Mincerian earnings function. For an explanation of these methods see Psacharopoulos (1995) and Psacharopoulos and Mattson (1998). Over the years, researchers have given preference to the Mincerian method because of its convenience (Mincer, 1974).

The concept of rate of return to education

The rate of return to schooling equates the value of lifetime earnings of the individual to the net present value of costs of education. For an investment to be economically justified, the rate of return should be positive, and should be higher than the alternative rate of return. For the individual, weighing costs and benefits means investing if the rate of return exceeds the private discount rate (the cost of borrowing and an allowance for risk).

The costs incurred by the individual are the foregone earnings while studying, plus any schooling fees or incidental expenses incurred. The private benefits amount to how much extra an educated individual earns (after taxes) compared with an individual with less education. *More* and *less* in this case refer to adjacent levels of education – e.g., university graduates compared to secondary school leavers.

The social rate of return includes the society's spending on education – for example, money spent on renting buildings and professorial salaries. The social attribute of the estimated rate of return refers to the inclusion of the full resource cost of the investment – the direct costs by government and the foregone earnings of students as they invest in their education. Ideally, the social benefits should include non-monetary benefits of education, such as the number of lives saved because of improved sanitation conditions followed by a woman because she has received more education. Given the scant empirical evidence on the social benefits of education, the social rate of return estimates are usually based on directly observable monetary costs and benefits of education. Since the costs are higher in a social rate of return calculation relative to the one from the private point of view, social returns are typically lower than a private rate of return. The difference between the private and the social rates of return reflects the degree of public subsidization of education – since practically the only difference is the addition of social costs.

Estimation issues

The Mincerian earnings function has been the subject of controversy in the literature (Psacharopoulos and Layard, 1979; Heckman et al. 2006). One issue with the Mincerian method of estimating returns to education is missing variables, e.g., ability bias. Griliches (1977) analyzed the issue many years ago. He found that the bias is small or negative. Adding more variables to the equation will not solve the problem and might add other biases (Patrinos 2016).

The earnings premium associated with the level of education suggests that productivity increases as people acquire additional qualifications. An alternative view is that earnings increase with education due to credential effects. This refers to the idea that higher levels of schooling are associated with higher earnings, not because they directly raise productivity, but because they certify that the worker is likely to be productive. In this sense, education merely sorts workers according to their unobserved attributes; it does not necessarily augment their intrinsic productivity. For public policy reasons it is important to distinguish between the human capital (productivity) and screening hypotheses about returns to education. In very basic terms, these two hypotheses mean, respectively: schooling imparts skills that enhance productivity; hence, increases in earnings are due to the increased productivity brought about by investments in schooling (human capital); while the screening hypothesis maintains that employers select workers with higher qualifications to reduce their risk of hiring someone with a lower capacity to learn; in this case, higher earnings may not be due to productivity alone (screening). With these concepts in mind, if the only purpose of schooling is to sort prospective employees, then questions arise as to the appropriateness of public investment in the expansion or improvement of schooling.

Layard and Psacharopoulos (1974) found no support for the screening hypothesis. Psacharopoulos (1979) made a distinction between the weak and the strong versions of the screening hypothesis. It is true that, at the hiring point, employers do not have enough information on the prospective productivity of a job applicant, so they might offer a premium to those who have a higher level of schooling relative to the rest. This is the weak version of screening. But after years on the job, such premium should diminish if the worker did not live up to the expectations. Such finding contradicts empirical data showing the earnings gap between more and less educated workers increases over time.

Card (2001) provides a rigorous test of the screening hypothesis by taking advantage of natural experiments such as changes in the school leaving age or college openings. By and large, while some evidence of weak screening is revealed, education is generally associated with higher earnings due to productivity rather than to screening. A recent analysis that uses rigorous evaluation techniques to compare the earnings of workers who barely passed versus those who barely failed high school exit exams finds little evidence of diploma screening effects (Clark and Martorell, 2014).

More recent analyses, which exploit data that permit the disaggregation of earnings by years of completed schooling, have questioned the linear nature of the earnings function approach. Furthermore, due to ongoing and rapid technological progress, cross-sectional data based on observations from many years in the past may produce biased estimates of the returns to schooling. Some have even questioned whether it is still possible to interpret the coefficient on schooling as

a rate of return (Heckman, Lochner and Todd 2006). For instance, some researchers argue that the literature following Mincer's estimated returns to schooling using cross-sectional data assumes that younger workers base their earnings expectations on the current experiences of older workers. However, if prices (the cost of schooling, for example, tuition associated with university) change over time and workers can at least partially anticipate these changes, then estimates of the returns to different schooling levels based on cross-sectional data may not represent the ex-ante rates of return governing human capital investment decisions. Relying on past cohorts to assess current investment decisions requires several strong assumptions, such as stability of the economic environment and perfect certainty of future earnings streams. This is difficult in the current context, given that emerging evidence suggests that wage patterns have changed substantially over time, making it difficult to use cross sections to approximate lifecycle earnings. One solution could be to follow actual cohorts over their entire educational and employment lifecycles to measure their earnings patterns to estimate the returns to education.

The debate is ongoing about the external validity and causality of rate of return estimates. More conclusive evidence will emerge once data on the lifetime earnings profiles of beneficiaries of voucher programs can be obtained, as many of these programs use lotteries to assign places, thus giving researchers access to randomized data. In 1981, Chile introduced nationwide school choice by providing vouchers to any student wishing to attend a "voucher school" (essentially, a private school participating in the program, whereby the funding from the voucher would be used to pay the fees and tuition). Beneficiaries of the vouchers obtained more schooling and subsequently earned more than non-voucher students. Also, it is estimated that formal sector earnings are higher for lottery winners in Colombia's large-scale government program which used a lottery to distribute scholarships for private secondary school to socially disadvantaged students. Institutional factors have also been used to more precisely estimate the returns to schooling, including the effect of birth date. Those who are forced to remain in school because of their birth date and the school attendance law receive the same rate of return to education as those who voluntarily continue schooling.

The Mincerian method gives private returns, whereas the full discounting method can give private and social returns. In interpreting the evidence presented below, the reader should bear in mind that Mincerian and full-discount returns are not directly comparable because they differ in scale. This is because, by construction, the Mincerian method tacitly assumes foregone earnings even for children aged 6 to 12 years, thus underestimating the true size of the returns (Psacharopoulos and Mattson 1998; Psacharopoulos 1995).

In our exposition below we start with private returns based on the Mincerian method, then move on to the full-discounting method that includes social returns.

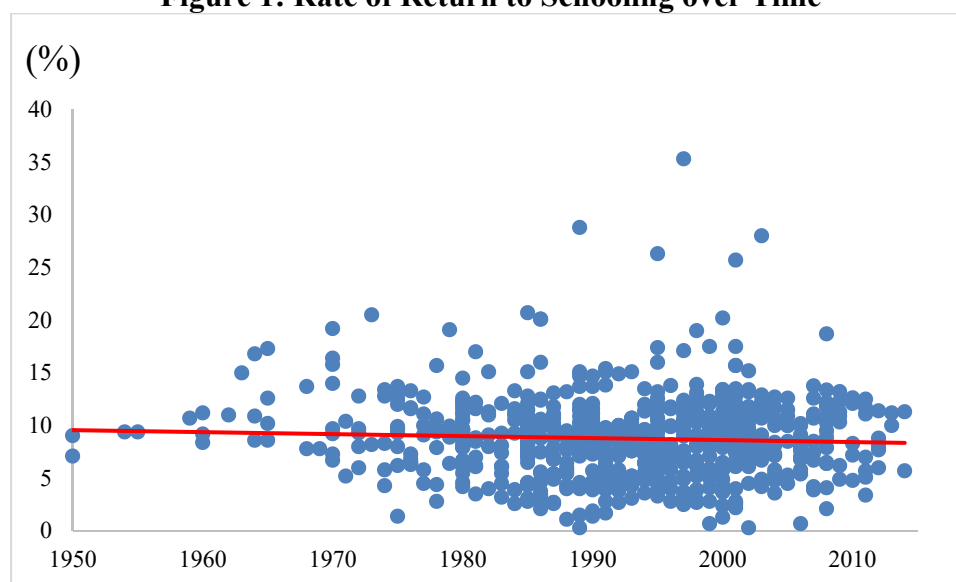
Results

Mincerian private returns

The coefficient on years of schooling of the basic Mincerian function gives an overall picture of the returns to education. Based on 705 estimates, over the years 1950 to 2014, the private rate of return to an additional year of schooling is 8.8 percent (see Annex 1; given the size of the database,

only summary statistics are reported here, while the rest can be found online in Annex 2¹). This is lower by about one percentage point relative to our (Psacharopoulos and Patrinos 2004a) compilation. It should be noted that the decline over time of the returns to education is very gradual and statistically insignificant (see Figure 1). This could be interpreted as a “race between education and technology” as the price of education fails to decline proportionately in the face of rapid supply increases (Tinbergen 1975). Thus, demonstrating that the demand for skill is outpacing the growth in supply of skills.

Figure 1: Rate of Return to Schooling over Time

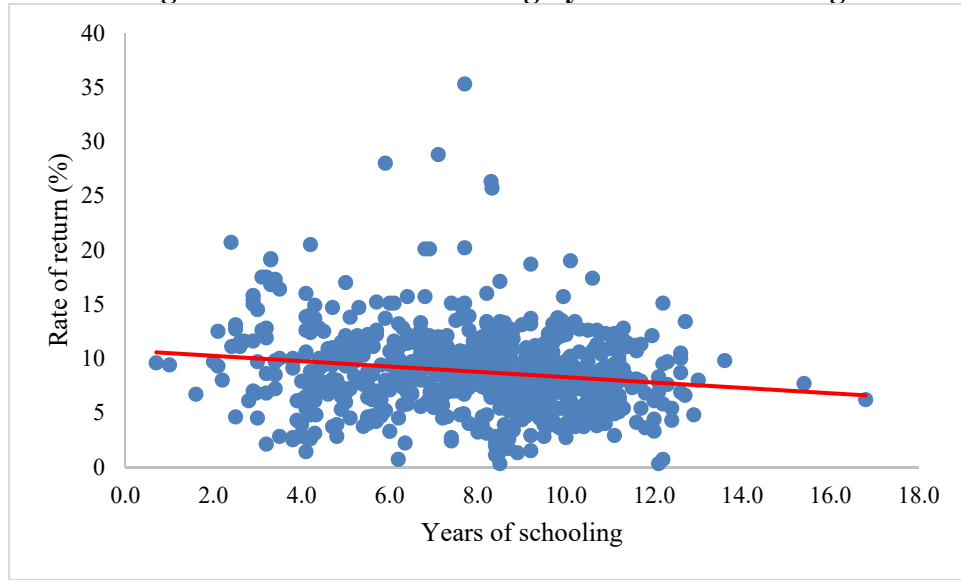


Note: Regressing the overall Mincerian rate of return on the year of the estimate, gives:
 $Return = 49.611 - 0.020Year$; $R^2=0.003$
 (t = 1.4)

Regressing the Mincerian overall return on the country’s years of schooling (S) in the survey year, yields a very small but statistically significant decline of the returns of about 0.2 percentage points for every additional year of schooling (see Figure 2).

¹ <http://datatopics.worldbank.org/education/files/GlobalAchievement/ReturnsEdAnnex2.xlsx>.

Figure 2: Return to Schooling by Years of Schooling



Note: Regressing the overall Mincerian rate of return on the year of the estimate, gives:
 $Return = 10.749 - 0.246 S$, $R^2 = 0.027$
($t = 4.4$)

Nevertheless, there has been an increase in the returns to schooling since 2000. Parsing the sample of estimates into pre- and post-2000 estimates, the returns have increased, albeit at a slower rate relative to the increase in the years of schooling (see Table 1). The schooling revolution of the 20th century continues, with an average increase in schooling years of more than 10 percent in the first decade and a half of the 21st century, as compared with the latter half of the 20th century. The returns to schooling increased in the 21st century by 4 percent relative to the latter half of the 20th century.

Table 1: Years of schooling and returns over time

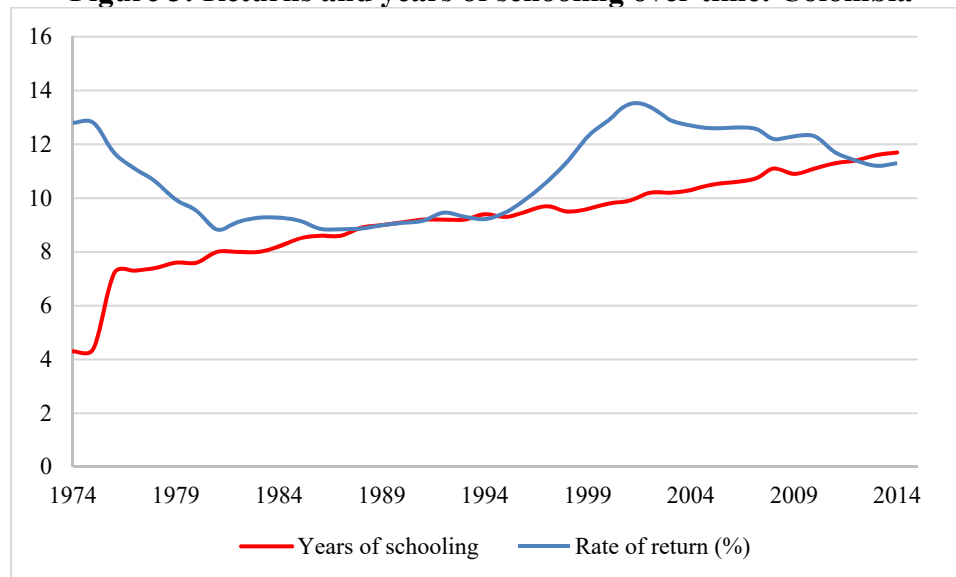
Period	Mean years of schooling	Overall Mincerian rate of return (%)	Number of studies
Pre 2000	7.8	8.7	511
Post 2000	8.6	9.1	194

Restricting the sample to the most recent estimate for each country, we get an average rate of return of 9.5 percent, just slightly lower than the 9.7 percent we obtained in our Psacharopoulos and Patrinos (2004a) update. Again, this could refer to Tinbergen's (1975) race between education and technology. The higher returns since 2000 suggest that the price of education is increasing even though supply is going up. This points to the interpretation that education is no longer winning the race.

Focusing on a single country is illustrative. For Colombia, we have a record of 35 return estimates over time (Psacharopoulos 1985, 1994; Patrinos 1995; Kaboski 2003; Sanchez Torres and Nunez Mendez 2003; Psacharopoulos, Arriagada and Velez 1992; Psacharopoulos and Velez 1992; Tenjo et al. 2015) since 1965. Taken together, we note a convergence to a 10 percent overall rate of return to a year of schooling. At the same time, average schooling had gone up considerably, from

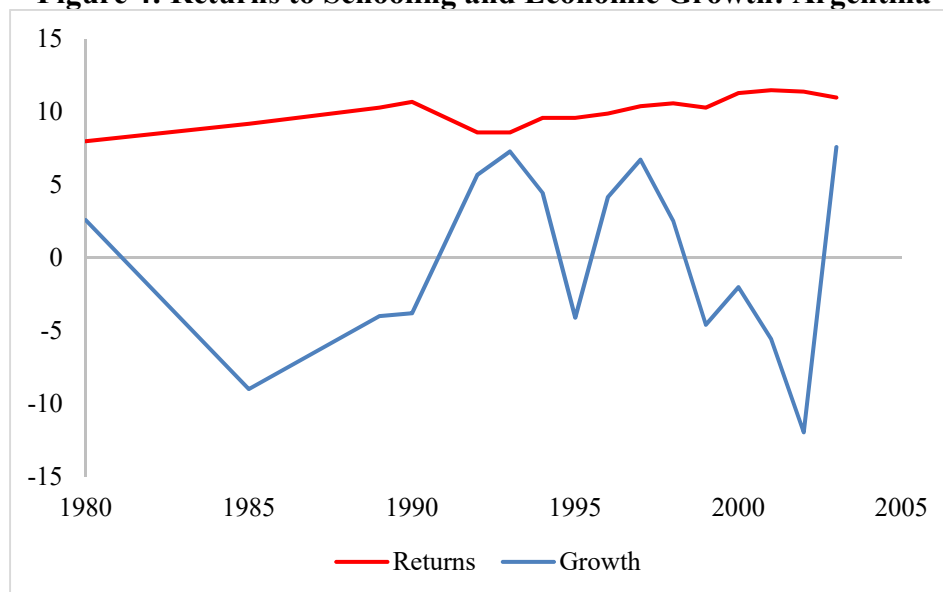
less than 5 years in the 1960s to more than 10 years by 2013 (see Figure 3).

Figure 3: Returns and years of schooling over time: Colombia



Focusing on Argentina, for which we have Mincerian returns (Kaboski 2003; Psacharopoulos 1994; Kugler and Psacharopoulos 1989; Lopez Boo 2010; Fiszbein, Giovagnoli and Patrinos 2007) over a 25-year period, we notice a remarkable stability of such returns even during the country's economic crisis (Figure 4). Note that the wide variation of the returns over time is due to different samples and methodologies.

Figure 4: Returns to Schooling and Economic Growth: Argentina

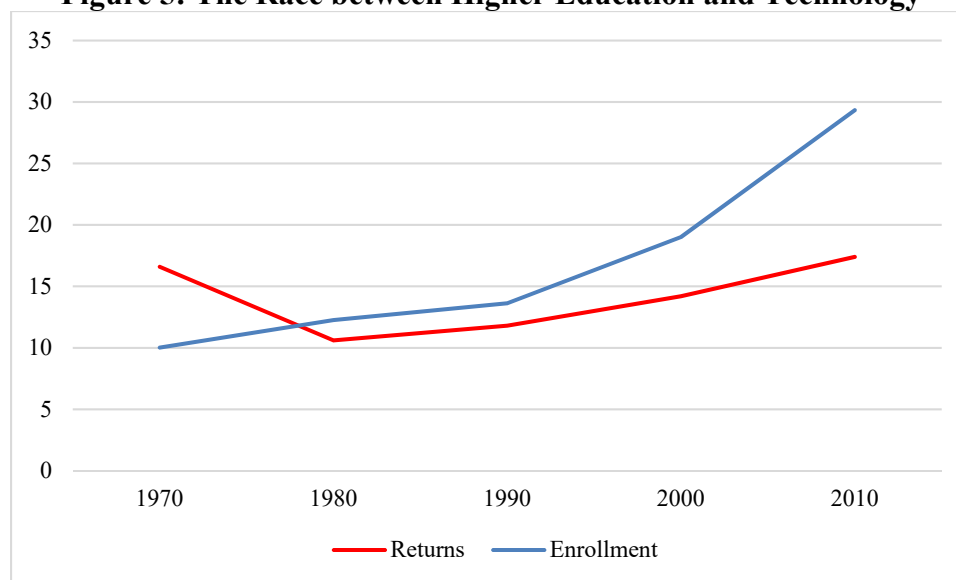


Note: Source of change in GDP per capita is World Bank World Development Indicators

This finding can be interpreted using Tinbergen's (1975) race between education and technology, in the sense that over time the education supply curve has been shifting more to the right relative

to the demand curve. This is most evident in the returns to higher education (see Figure 5). While enrollment in higher education has gone up three-fold since 1970, the returns have not changed overall. The increased share of the labor force with higher education should have reduced the rate of return on the investment. Yet, the rates of return over time do not fluctuate much because as the supply of educated labor increases, so does the demand for higher skills, hence not depressing the returns to education. As discussed by Goldin and Katz (2010), the race reflects, on the one hand, the skill-biasedness of technological progress with its consequences for income inequality and, on the other hand, to the pivotal role of education in mediating this relation. While higher education increased substantially, the premium on high skills continued to increase. This suggests that educational advancements were insufficient to countervail demand due to technological progress. The rising inequality implies that technology is winning this race.

Figure 5: The Race between Higher Education and Technology



Income level and regional differences

Private returns to schooling are higher in low-income countries by about one percentage point relative to high-income countries (see Table 2). This is the case even though the mean years of schooling differs by a factor of almost two between country groups. In fact, years of schooling will peak, to about 10 years by 2050.

Table 2: Private Returns to Schooling by Income Group

Country income level	Overall rate of return (%)	Mean years of schooling
Low	9.3	5.0
Middle	9.2	7.0
High	8.2	9.2
World average	8.8	8.0
Notes: Country per capita income levels based on World Bank (2016) classifications in 2015 US\$: low = \$1045 or less; middle = \$1046-\$12,735; high = \$12,736 or more		

Disaggregating further by world region, private returns to schooling are highest in Latin America and Sub-Saharan Africa and lowest in the Middle East and North Africa (see Table 3). The Middle East and North Africa is an outlier, given the relatively low average level of schooling. Kingsbury (2018) provides several hypotheses for the low returns citing such factors as corruption, natural resources and poor academic performance. While South Asia exhibits relatively low returns, within the region India has seen increasing returns since the economic liberalization program of the 1990s.

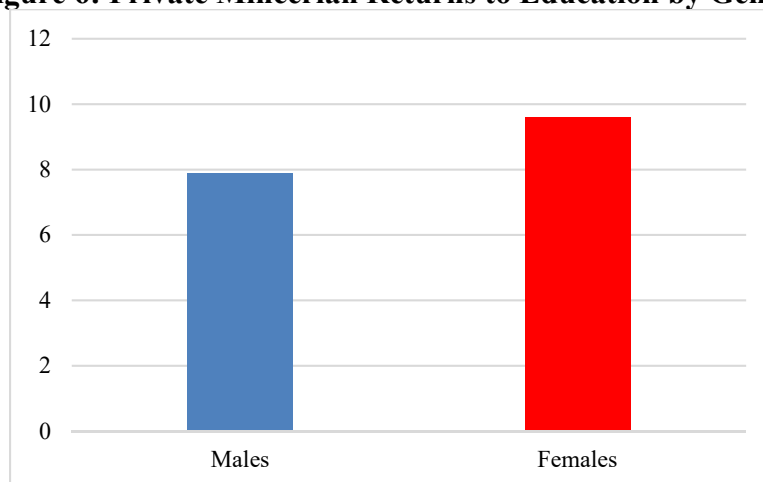
Table 3: Private Returns to schooling by region

Region	Overall rate of return (%)	Mean years of schooling
Latin America and Caribbean	11.0	7.3
Sub-Saharan Africa	10.5	5.2
East Asia and Pacific	8.7	6.9
South Asia	8.1	4.9
Advanced Economies	8.0	9.5
Europe and Central Asia	7.3	9.1
Middle East and North Africa	5.7	7.5
World average	8.8	8.0

Gender

As in previous reviews, the private returns to female education exceed that of males by about two percentage points (see Figure 6). The gap has increased. The female advantage was just over one percentage point in previous updates (Psacharopoulos and Patrinos 2004a; Psacharopoulos 1994). This does not imply that earnings are higher for females, but only that education is a good investment for women and girls, and a development priority.

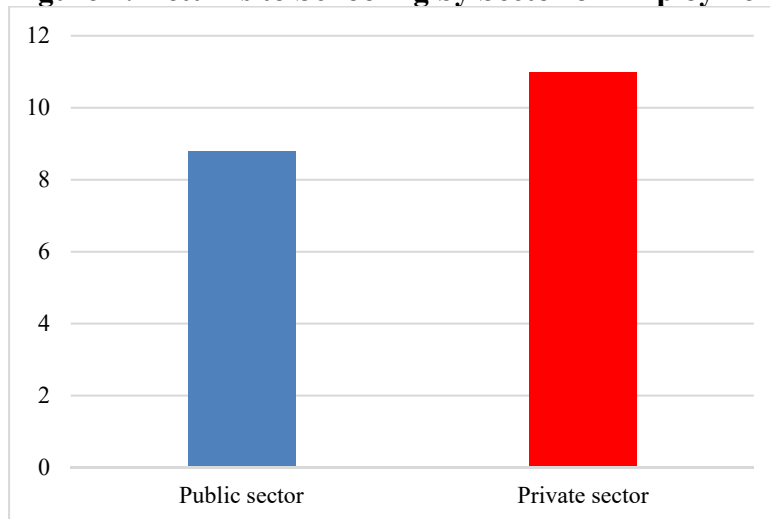
Figure 6: Private Mincerian Returns to Education by Gender



Private sector of employment

The returns for those working in the private sector of the economy are higher than for those working in the public sector. The finding lends credibility that, where productivity matters, education is recognized (Psacharopoulos 1983; Harmon, Oosterbeek and Walker 2003). There is a clear earnings advantage for workers in the private sector (see Figure 7).

Figure 7: Returns to Schooling by Sector of Employment



Full discounting method and social returns

Based on 166 estimates using the full discounting method, the returns to schooling fall by level of economic development (see Table 4). The private returns to primary education are still high, but there are fewer countries where this calculation can be made given the drive for universal primary education. The private returns to higher education are substantial and have remained high since the last update. They have increased since the last update in both low- and high-income countries, falling only in middle-income countries. The returns to secondary education have declined, but not in high-income countries.

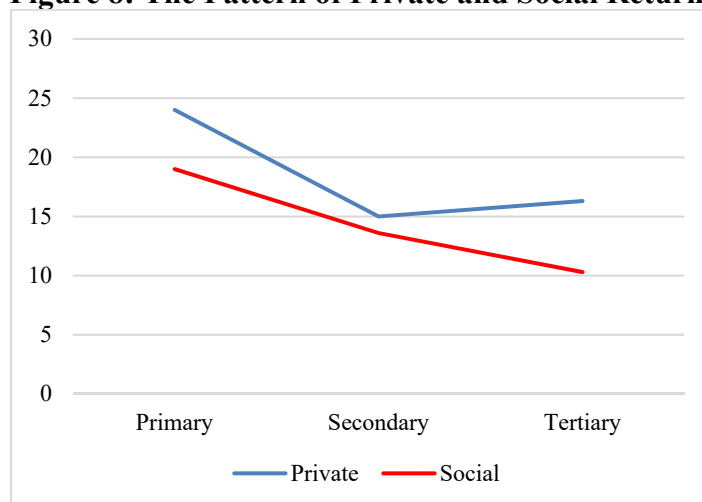
Table 4: Returns by income and educational level (%)

Per capita income level	Private			Social		
	Primary	Secondary	Higher	Primary	Secondary	Higher
Low	25.4	18.7	26.8	22.1	18.1	13.2
Middle	24.5	17.7	20.2	17.1	12.8	11.4
High	28.4	13.2	12.8	15.8	10.3	9.7
Average	25.4	15.1	15.8	17.5	11.8	10.5

Note: The “high” private return to primary education in high-income countries is due to an outlier 1959 estimate of 65% for Puerto Rico, a country classified as high-income under our current-per-capita income classification system.

The social returns follow the well-known pattern of falling by level of development and level of education. Social returns to education are universally lower than private returns because of the public subsidization of education. Social returns are lower than private because researchers can account for full social costs, but they do not include social benefits. The costs of higher levels of schooling are much higher, hence the lower returns (see Figure 8).

Figure 8: The Pattern of Private and Social Returns



As a rule, returns are higher in lower-income countries relative to higher-income countries (see Figures 9 and 10). This can be attributed to the relative scarcity of human capital in the two types of countries. For example, the mean years of schooling of the labor force in Sub-Saharan Africa is 5.1, compared with 10.2 in advanced economies.

Figure 9: The Structure of Private Returns

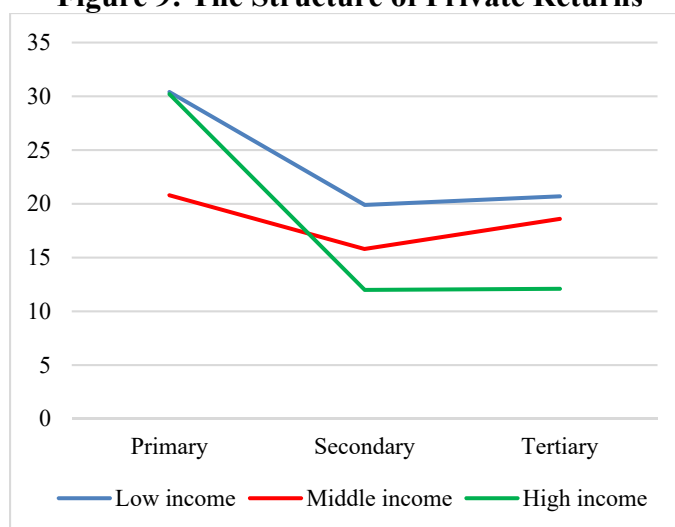
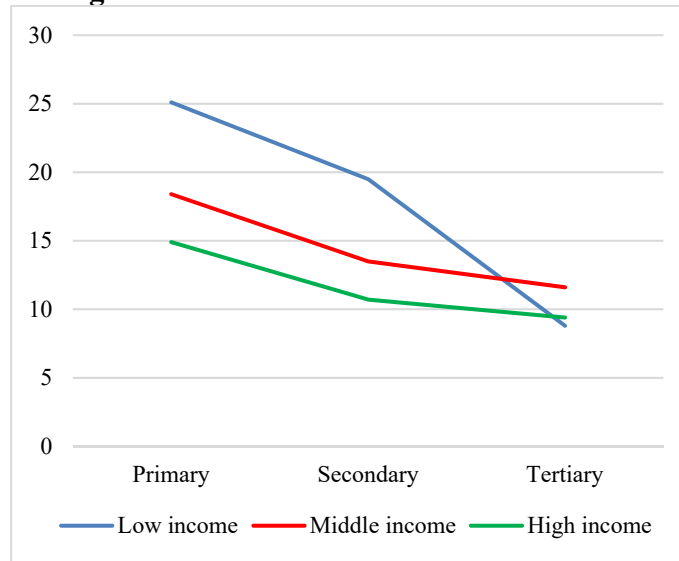


Figure 10: The Structure of Social Returns



Private and social returns by region

In our previous analysis (Psacharopoulos and Patrinos 2004a) we presented estimates from 83 countries and showed that the returns to education were highest in Sub-Saharan Africa, the region with the lowest levels of schooling. With near universal primary education in most regions, it is becoming difficult to estimate returns to primary schooling using recent surveys and the full discounting method. Our update – using estimates since 2000 – is dominated by such returns from high-income countries, which exclude returns to primary education (since the comparison group, that is, workers with no education, is absent). Overall, private returns to secondary and higher education in high-income countries are high, at 13 and 12 percent (see Table 5).

Table 5: Private and Social Returns to Schooling by Region, post-2000 (%)

	Private		Social	
	Secondary	Higher	Secondary	Higher
Average	13.2	12.4	10.2	10.6
Developing countries	--	--	10.2	16.4
Number of studies	50	54	59	61

Note: For private returns, sample consists of high income countries plus Turkey; for social returns, two are from Africa, two are from Latin America, one is from Europe, one is from East Asia, and the rest are from high income countries.

In terms of social returns, these are higher than any plausible social discount rate though lower than private, across all income groups. The social returns to higher education are particularly high, but these are driven by returns in Africa, where the social returns to higher education are 35 percent in Malawi (Chirwa and Matita 2009) and 22 percent in South Africa (Salisbury 2015) – this of course implies that private returns to higher education are even higher.

Discussion

The rate of return patterns found in previous updates are upheld and reinforced. Regarding efficiency in the use of resources, spending on human capital is a good investment. For example, in the United States the long-term 1966 to 2015 average return on stocks and bonds is 2.4 percent (Damodaran 2016) versus a 10.5 percent overall private return to investment in education in our database for education.

Recent research indicates that the social rates of return reported above are under-estimates of the true returns because of the omission of externalities (Munich and Psacharopoulos 2017). Taking just one externality into account, the social rate of return to investment in education could be 50% higher than the one traditionally estimated. Monetizing the value of just one externality of education - reduced mortality - Pradhan et al. (2018) found that the social rate of return to investment in one extra year of schooling in low-income countries is 16%, relative to 11% based solely on earnings differentials.

In allocating an education budget among different levels of schooling, priority should be given to the lower levels of education in countries that have not yet achieved universal primary.

In countries with disparities between male and female enrollment, priority should be given to the education of girls.

The size of the private returns to education and difference between private and social rates calls for selective cost recovery in higher education.

The overall 10 percent private return to one year of schooling has marginally declined since first estimated over half a century ago (see, for example, Becker 1964).

When making education decisions, it is very tempting to use estimates as those presented above for countries that lack such information. We emphasize that there is no substitute for a country-specific study.

In such case, we recommend using the full discounting method as it is more appropriate relative to the Mincerian method.

Future updates will attempt to include estimates of the returns to school quality. Although there are plenty of macro studies in this respect, micro studies on the returns to investing in specific school quality inputs are emerging.

Text references

(References to the database used in this compilation are found on-line in Annex 3.²)

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Annex 1: Returns by educational level and type, most recent survey year (%)

Economy	Year	Overall Mincerian	Full discounting						Source ³
			Private			Social			
			Prim	Sec	Higher	Prim	Sec	Higher	
Albania	2012	8.0							Miluka (2015)
Algeria	2001	2.2							Arbak (2012)
Argentina	2003	11.0							Lopez Boo (2010)
Australia	2010	8.3							Mariotti and Meinecke (2011)
Austria	2011			10.4	9.9		8.8	7.1	OECD (2015)
Azerbaijan	1995	3.7							Peet et al (2015)
Bangladesh	2006	10.0							Taposh and Lin (2009)
Belarus	2002	6.9							Yemtsov et al (2006)
Belgium	2009				10.7			14.5	OECD (2013)
Belize	2005	10.0							Hausman and Klinger (2007)
Bolivia	2002	10.3							Patrinos et al 2009
Bosnia & Herzegovina	2002	8.1							Peet et al (2015)
Brazil	2001	15.7							Patrinos et al 2009
Bulgaria	2003	6.7							Flabbi et al (2008)
Cambodia	2007	6.7							Lall and Sakellariou (2010)
Cameroon	1995	6.0							Banerjee and Duflo (2005)
Canada	2011			11.2	12.9		6.9	7.4	OECD (2015)
Chile	2011				14.8		8	15.5	OECD (2015)
China	2009	10.3							Ding et al (2013)
Colombia	2014	11.3							Tenjo et al (2015)
Costa Rica	1992	8.5							Banerjee and Duflo (2005)
Cyprus	1994	5.2							Banerjee and Duflo (2005)
Czech Republic	2011			14.2	19.9		22.6	15.3	OECD (2015)
Denmark	2011			14.4	7.9		8.7	3.9	OECD (2015)
Djibouti	1996	11.6							Anos-Casero and Seshan (2006)
Ecuador	2002	6.5							Peet et al (2015)
Egypt, Arab Rep.	2011	3.4							Rizk (2016)
El Salvador	1992	7.6							Funkhouser (1996)
Eritrea	2002	10.9							Kifle (2007)
Estonia	2011			21.9	17.1		6.6	5.6	OECD (2015)

³ References are listed on-line in Annex 3

(<http://datatopics.worldbank.org/education/files/GlobalAchievement/ReturnsEdAnnex3.docx>).

Ethiopia	2011	12.5							Peet et al (2015)
Finland	2011			6.1	8.4		20.6	6.1	OECD (2015)
France	2009			9.4	9.5		6.6	6.9	OECD (2013)
Gambia, The	2003	6.8							Foltz and Gajigo (2012)
Georgia	2006	6.9							Botchorishvili (2007)
Germany	2011								OECD (2015)
Ghana	2007	4.2							Peet et al (2015)
Great Britain	2011			11	12.2		45.6	30.3	OECD (2015)
Greece	2009			5.9	8.6		5.4	11.6	OECD (2013)
Guatemala	2000					11.2	19	13.1	Laguna and Porta (2004)
Honduras	1991	9.3							Funkhouser (1996)
Hong Kong SAR, China	1996					6.3	9.5	10	Yeung (1999)
Hungary	2011			14.2	20.8		26.5	20.5	OECD (2015)
Iceland	2003			7.2	5		7.9	5.6	OECD (2006)
India	2008	10.8							World Bank (2011)
Indonesia	2007	10.7							Sohn (2013)
Iraq	2006	0.7							Peet et al (2015)
Ireland	2009			20.9	17		6.2	15.4	OECD (2013)
Israel	2011			11.1	12.1		5.1	9.5	OECD (2015)
Italy	2010			8.1	9.5		6.6	8.6	OECD (2015)
Jamaica	1989	28.8	20.4	15.7		17.7	7.9		Psacharopoulos (1994)
Japan	2007				7.6			7.3	OECD (2013)
Jordan	2001	6.7							Arbak (2012)
Kazakhstan	2001	8.0							Arabsheibani and Mussurov (2006)
Kenya	1995								Wambugu (2002)
Korea, Rep.	2011			3.7	5.9		-0.7	0	OECD (2015)
Kuwait	2010	4.8							Alqattan (2012)
Latvia	2012	7.7							Vilerts et al (2015)
Liberia	1983		99	30.5	17	41	17	8	Psacharopoulos (1994)
Luxembourg	2010			10.2			10.1		OECD (2015)
Madagascar	1993	15.1							Cogneau (2003)
Malaysia	2002	10.0							Ismail (2007)
Malawi	2012	8.8							Gondwe (2015)
Maldives	2004	8.1							World Bank (2011)
Malta	2001	25.7							Arbak (2012)
Mexico	2002	13.2							Metzger and Patrinos (2005)
Moldova	2003	8.0							Flabbi et al (2008)

Mongolia	2002	8.5							Patrinos et al 2009
Morocco	2001	2.8							Arbak (2012)
Namibia	2003	28.0							Godana and Ashipala (2006)
Nepal	2008	7.9							World Bank (2011)
Netherlands	2011			5.5	9.1		10.8		OECD (2015)
New Zealand	2011			8.3	7.6		7.7	5.7	OECD (2015)
Nicaragua	2001					5.2	9.5	11.4	Belli and Ayadi (1998)
Niger	2011	11.1							Peet et al (2015)
Nigeria	2011	5.7							Peet et al (2015)
Northern Ireland	1995	17.4							Trostel et al (2002)
Norway	2011				8.7		7.1	4.5	OECD (2015)
Pakistan	2009	6.2							World Bank (2011)
Palestine	2011	5.1							Rizk (2016)
Panama	2009	10.9							Freire et al (2015)
Papua New Guinea	1987	11.1							Gibson and Fatai (2006)
Paraguay	1990	11.6	23.7	14.6	13.7	20.3	12.7	10.8	Psacharopoulos (1994)
Peru	2001	10.7							Trivelli (2006)
Philippines	2000	12.6							Kaboski (2003)
Poland	2010			10.2	26.6		6.9	13.9	OECD (2015)
Portugal	2011			13.6	19.6		5.7	11.3	OECD (2015)
Puerto Rico	1989	15.1							Griffin and Cox Edwards (1993)
Romania	2009	11.3							Ion Zgreaban 2013
Russian Federation	2002	9.2							Gorodnichenko and Klara (2005)
Senegal	1985		33.7	21.3		23	8.9		Psacharopoulos (1994)
Serbia	2013	10.0							Popov (2013)
Sierra Leone	1971					20	22	9.5	Psacharopoulos (1994)
Singapore	2000	13.2							Low et al 2004
Slovak Republic	2011			29.5	17.7		18.9	12.6	OECD (2015)
Slovenia	2011			10.3	16.8		10.1	12.7	OECD (2015)
Somalia	1983		59.9	13	33.2	20.6	10.4	19.9	Psacharopoulos (1994)
Spain	2011			12.9	9.8		9.6	6.5	OECD (2015)
Sri Lanka	2008	8.9							World Bank (2011)
Suriname	1992	9.9					10.8		Horowitz and Schenzler (1999)
Sweden	2011			18.3	7.8		21	1.7	OECD (2015)

Switzerland	2011						7.6	2.8	OECD (2015)
Thailand	2010	12.6				3.4	5.7	11.3	Tangtipongkul (2015)
Timor-Leste	2007	3.9							Santos (2014)
Tunisia	2011	7.0							Rizk (2016)
Turkey	2008	11.8							Tansel and Daoud (2014)
Uganda	2008	11.9							Peet et al (2015)
Ukraine	2002	4.5							Gorodnichenko and Klara (2005)
United States	2011			20.5	14		11.9	11.9	OECD (2015)
Uruguay	1990	9.1							Kaboski (2003)
Venezuela, RB	2008	6.4							Gonzales and Oyelere (2009)
Vietnam	2014	5.7							Doan et al (2016)
Yemen, Rep.	1985		10	41	56	2	26	24	Psacharopoulos (1994)
Zambia	1995	10.7			19.2			5.7	Banerjee and Duflo (2005)
Zimbabwe	1994	5.6	16.6	48.5	5.1	11.2	47.6	-4.6	Banerjee and Duflo (2005)