

Discussion Paper No. 04-17

**What a Difference Immigration  
Law Makes: PISA Results, Migration  
Background and Social Mobility  
in Europe and Traditional Countries  
of Immigration**

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Economic Research

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*Non-technical summary:* The purpose of this article is to evaluate the importance of social class, migration background and command of national languages for the PISA school performance of teenagers living in European countries (France, Finland, Germany, United Kingdom, and Sweden) and traditional countries of immigration (Australia, Canada, New Zealand and the US). Our results show that the impact of the socioeconomic background of parents differs strongly across nations. The influence is quite high in Germany, the UK and US, whereas dependency on social classes is less important in Scandinavian countries and in Canada. Our empirical results also clearly reveal that for students with a migration background a key for catching up is the language spoken at home. We conclude that educational policy should focus on integration of immigrant children in schools and preschools, with particular emphasis on language skills at the early stage of childhood.

# What a Difference Immigration Law Makes: PISA results, migration background and social mobility in Europe and traditional countries of immigration<sup>#</sup>

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*Summary:* The purpose of this article is to evaluate the importance of social class, migration background and command of national languages for the PISA school performance of teenagers living in European countries (France, Finland, Germany, United Kingdom, and Sweden) and traditional countries of immigration (Australia, Canada, New Zealand and the US). Econometric results show that the influence of the socioeconomic background of parents differs strongly across nations, with the highest impact found for Germany, the UK and US, whereas social mobility is more likely in Scandinavian countries and in Canada. Our empirical results imply that for students with a migration background a key for catching up is the language spoken at home. We conclude that educational policy should focus on integration of immigrant children in schools and preschools, with particular emphasis on language skills at the early stage of childhood.

*Key words:* PISA tests, socioeconomic status, migration, social mobility, language skills

*JEL Classification codes:* I20, J15, J18, O15, Z13

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## 1. Introduction

Students from three traditional countries of immigration, Australia, Canada, and New Zealand, performed surprisingly well compared with students from the other remaining 29 countries participating in the Programme for International Student Assessment (PISA). Looking at the assessment of reading literacy, which has been the focus of the OECD PISA tests in 2000 (see OECD, 2001, for details), Canada is ranking second, New Zealand is third and Australia is ranking fourth.<sup>1</sup> Only teenagers from Finland had a significantly better score. Some other European countries such as France and Germany but also the US performed significantly worse than these top-performing countries. In response to these results, there is an ongoing discussion about the reasons for differing average reading proficiency levels across countries. In particular Germans were stunned to learn that the performance of their school system that produced the Goethes and Einsteins was well below the OECD average.

It seems that poor results of badly integrated children from socially less advantaged families contribute to the problem. First results based on a national German sample extension (PISA-E) of the international test (PISA 2000) confirm that as in almost no other country social and ethnic background seem to determine student achievement as much as in Germany (Stanat 2003, Baumert et al. 2003). Educational researchers argue that the system of early differentiation by skill level (as it is applied in Germany) has a negative impact on the school performance of children who come to school with language and social deficits, a high proportion of whom come from families with migration background. Early division may not give these children the basic skills before they are separated into the better or weaker school systems. The average German reading score result of PISA 2000 seems to be negatively affected by the weak results of teenagers who attend the less challenging middle-level secondary school ('Realschule') and in particular by the very poor results of pupils from the lowest-level

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<sup>1</sup> Scientific and mathematical literacy will be the focus in 2003 and 2006, respectively. In 2000, there were fewer mathematics and science items included in the assessment and administered to a sub-sample of participants. In these tests, too, Australia, Canada, and New Zealand were among the top performing nations. Only Japan, Korea and Finland performed better than this group of countries (OECD, 2001).

secondary school ('Hauptschule'), which is mainly attended by children with a low socioeconomic status.<sup>2</sup>

The German school environment stands in striking contrast to the situation in Australia, Canada, and New Zealand. Whereas in Germany and other European countries socially less privileged children often come from families with (labour) migration background, so-called 'traditional countries immigration' (from which the USA needs to be omitted because of its different immigrant situation mainly influenced by the Mexican border) follow an immigration policy that seeks to admit selected applicants with high education, good language skills and the flexibility to contribute to the countries' human resource base by quickly and effectively matching their skills with opportunities in these countries (see, Inglis 2002, Ray, 2002, and Bedford, 2003, for recent surveys on immigration policies in Australia, Canada and New Zealand, respectively).

The purpose of this article is to highlight the importance of social class and migration background for the PISA school performance of teenagers. A special focus of this article is to provide information on the performance of immigrants, a topic rarely discussed in the literature.<sup>3</sup> As different regimes of immigration policy produce quite different immigrant populations, we include, on the one hand, a group of European countries (France, Germany, United Kingdom, and Sweden) with labour migrants representing the majority of immigrant populations, though with different countries of origin. Whereas in France, Germany and Sweden immigrants mainly come from less industrialised non-Western countries such as Turkey, North Africa, former Yugoslavia, Poland, Russia and other countries from Eastern or Central Europe, or from outside Europe (France also has large inflows from former colonies, see Hamilton, Simon and Veniard, 2002, for details), labour migrants from EU countries and from India account for a large share

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<sup>2</sup> Whereas the average of the so-called 'highest socioeconomic index' (HISEI, see also below) of families in Germany in lowest-secondary schools ('Hauptschulen') is 39.9, it is 57.2 in the highest secondary school ('Gymnasium'). Moreover, 31.1 percent of all children in 'Hauptschulen' have parents with a full migration background (both parents are foreign born), whereas only 8.2 percent of students in 'Gymnasium' have both parents born abroad (Baumert et al. 2003, p. 273).

<sup>3</sup> Notable exceptions with German focus are Gang and Zimmermann (2000), Frick and Wagner (2001), Stanat (2003) and Weber (2003).

of the foreign work force in UK.<sup>4</sup> On the other hand we include the four traditional countries of (selected) immigration Australia, Canada, New Zealand and the USA. Mainly for reasons of a benchmarking comparison, we also consider the best-performing country of the international PISA test, Finland - a country which is almost unaffected by major immigration flows.<sup>5</sup>

Our econometric results show that the impact curves of the socioeconomic status of parents ('socioeconomic gradients') on the school performance of their children differ strongly across countries, with steepest ascents for Germany, UK and US, whereas flattest slopes were estimated for Finland and Canada. Moreover, we find that educational inequalities between social classes can be enormous, as can be seen from the difference in PISA reading scores of students with and without migration background. Calculation of different scenarios shows that the gap of the most disadvantaged migration group (foreign parents, foreign language spoken at home) when compared to the group of natives (students born in the country, national language spoken at home) amounts to 105.7 PISA score points for Germany and 83.8 for France. In contrast to these results, differences in Australia (27.5) and Canada (25.5) are much smaller. However, empirical results also show that a key for catching up is the language spoken at home. Reading proficiency scores of migrant students improved substantially when the language spoken at home is the national language instead of some foreign language. Imputation of respective migration backgrounds reveals that most significant upward shifts in reading literacy due to language skills can be observed for New Zealand (71.5), Germany (61.9) and the US (60.3).<sup>6</sup>

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<sup>4</sup> According to SOPEMI 2002 (OECD 2003), 2.59 million (which equals 4.3 percent of the British population) non-nationals were living in Great Britain of which the biggest group (436 thousand) is Irish, followed by migrants from the US (148 thousand), India (132 thousand), Italy (102 thousand), France and Pakistan (both 82 thousand).

<sup>5</sup> In Finland, only 1.2 percent of students participating in PISA 2000 have parents with a full migration background (both parents born abroad), whereas these figures are much higher in all other countries under consideration (Australia: 22.8, Canada: 20.5, New Zealand: 19.7, USA: 13.6, France: 12.0, Germany: 15.3, Sweden: 10.5, United Kingdom: 9.2, source: Baumert and Schümer, 2001, p. 348).

<sup>6</sup> Note that the official OECD average is normalised to 500, with Finland's top score being 546, and Germany's score published by the OECD being 484.

This paper is organized as follows. Section 2 presents descriptive evidence and characterises our sample of countries with respect to migration background, socioeconomic status and PISA reading literacy scores. In Section 3 the educational gap between migrants and non-migrants is analysed using econometric methods. Imputation of PISA scores dependent on hypothetical migration/non-migration backgrounds is presented in Section 5. Section 6 sums up and concludes.

## **2. Characterisation of Countries by Migration Background, Socioeconomic Status and PISA Scores**

As explained in more detail elsewhere (in particular, OECD 2001; further interesting sources are national institutes which cooperated with OECD; see, for instance, Statistics Canada, 2003), the Programme for International Student Assessment (PISA) is a joint effort among member countries of the Organisation for Economic Co-operation and Development (OECD) to assess the achievement of 15-year-olds in reading literacy, mathematical literacy and scientific literacy through a common international test. PISA defines reading literacy as the ability to understand, use and reflect on written texts in order to participate effectively in life. PISA is a three-phase study with the first phase in 2000, the second in 2003 and the third in 2006. In 2000 the main domain assessed was reading literacy. Mathematical literacy and scientific literacy were minor domains assessed in a sub-sample of reading literacy participants. More than 250,000 students took part in PISA from the 32 participating countries (Netherlands's results are not included in the final report and four non-OECD countries participated). A minimum of 150 schools and 4500 students had to be selected in each country according to the sample design prepared by OECD scientists (see Krawchuk and Rust, 2002). As an exception to the rule, in Canada, approximately 30,000 students from more than 1,000 schools took part. A large Canadian sample was drawn upon so that information could be provided at both national and provincial levels (see Statistics Canada, 2003, for details). Students from the United Kingdom represent a further exception with more than 9,000 teenagers in the PISA data set (see Adams and Carstensen, 2002, for the number of sampled students by country).

Table 1 presents average reading literacy scores for all nine nations of interest.<sup>7</sup> It first replicates the well known fact that traditional countries of

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<sup>7</sup> The scores represent six levels of knowledge and skills. Level 5 corresponds to a score of more than 625, level 4 to scores in the range 553 to 625, level 3 to scores from 481 to



immigration (except the US) perform much better than the European countries (except Finland).<sup>8</sup> In addition, Table 1 compares national averages and medians to results of immigrant students with a full migration background, i.e. pupils from families with both parents born abroad. Likewise, this comparison reveals the much better performance of immigrant children in Australia, Canada and New Zealand. Also, immigrant teenagers in the UK reach a higher reading proficiency level than migrant juveniles in France, Germany and Sweden. This also holds for migrants in Finland, although they do not play a significant role for national averages (only 1.2 percent of all participants have both parents born abroad). In Germany, for instance, the median difference between migrants and the national average amounts to 79.8 (note that the difference between migrants and non-migrants is still higher as migrants represent 14 percent of the sample), whereas it is even negative for Canada (-2.2).

One of the main scientific advantages of PISA 2000 is the collection of information about the students' individual environment. As already stressed by other authors, a central finding of the PISA survey is the importance of the socioeconomic and educational background of parents which seems to be of high importance in Germany, in particular for immigrants living in Germany.<sup>9</sup> Table 2 presents a comparison of the 'International Socio-

552, level 2 to scores from 408 to 480, level 1 to scores from 335 to 407. Students scoring below 335 points are not able to show the most basic skills that PISA sought to measure.

<sup>8</sup> Note that we use unweighted statistics of the OECD PISA data set. Most average means show only very small or no deviations from official statistics published by the OECD which have undergone complex weighting schemes (Krawchuk and Rust, 2002): see, for instance, official numbers for Australia, Finland, France and Sweden, respectively (in parentheses: unweighted means): 528 (526), 546 (549), 505 (503) and 516 (516). Some notable difference does exist for Germany, where OECD publications give higher weights to results of weaker students: the unweighted mean amounts to 498, whereas the OECD mean is only 484. Thus, already high differences between migrants and non-migrants in Germany found in this article might be considered a conservative estimate.

<sup>9</sup> Using data from the German Socioeconomic Panel (GSOEP), Gang and Zimmerman (1999) as well as Frick and Wagner (2001) showed that immigrant children from disadvantaged families are not able to close the educational gap between themselves and their native German counterparts. Evidence provided by Fertig and Schmidt (2002), Fertig (2003) and Weber (2003), among others, based on PISA data and quantile regressions reveals the high importance of several factors related to family issues. Wößmann (2003) showed the importance of family characteristics using data of the Third International

Economic Index of Occupational Status' (ISEI) of parents (average of both parents). ISEI is mainly based on education, income and age of occupational groups in a path analytic model that minimises the direct effect of education on income and maximises the indirect effect of education on income through occupation (see Ganzeboom et al, 1992, for the construction of ISEI). The one-dimensional measurement of socioeconomic status based on ISEI (instead of multidimensional treatment of underlying socioeconomic variables) has been made popular by the OECD PISA research group (OECD 2001), which calculated many statistics and provided rich and detailed background information on school performance by use of ISEI. We try to make our results compatible to this literature, which is mainly interdisciplinary and touches many fields such as educational economics, social sciences and educational research. We thus contribute to this literature by focussing on ISEI instead of including education, income and age as separate variables. Some other advantage of this research strategy is that parsimonious and one-dimensional characterization of socioeconomic status facilitates comparisons between countries.

National averages of ISEI remain in a small range with a (rounded) maximum found for Australia (46) and minimum index values for France and Canada (44). All median values remain below averages indicating positively skewed distributions (right side of distribution extends much farther out than the left).

As regards the social background of immigrant families, Table 2 reveals the key difference between the traditional countries of immigration, Australia, Canada and New Zealand, but also the UK, on the one hand, and France, Germany and Sweden on the other hand. Whereas median ISEI is at least 43 for the first group of countries (with a maximum of 50 for New Zealand), it is at most 36 for the latter group of European labour migrants (with a minimum of 33 for Germany). Even more symptomatic of a differing immigration policy is that within traditional countries of immigration the socioeconomic status of migrants even exceeds that of national averages, partly in a significant way (see Canada and New Zealand). At the other extreme, nation-wide ISEI median values of parents exceed that of parents from students with a migration background by 7 points in Germany and Sweden.

Mathematics and Science Study (TIMSS). Baumert et al (2003) and Stanat (2003) highlight the importance of ethnic origin and socioeconomic background using data from the extended German PISA-E sample.

**Table 1: Comparison of mean reading literacy scores**

|  | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA   | Fin-<br>land | France | Ger-<br>many | UK    | Swe-<br>den |
|--|----------------|-------------|---------------------|-------|--------------|--------|--------------|-------|-------------|
| All students   |                |             |                     |       |              |        |              |       |             |
| Mean   | 526.6          | 524.2       | 527.3               | 496.0 | 548.5        | 502.8  | 497.7        | 524.0 | 515.9       |
| Std<br>Dev   | 105.1          | 96.2        | 106.9               | 103.9 | 87.5         | 91.9   | 103.7        | 101.3 | 91.8        |
| Me-<br>dian  | 533.8          | 528.4       | 535.7               | 499.9 | 554.0        | 509.4  | 504.8        | 528.4 | 523.0       |
| Nobs.  | 5176           | 29687       | 3667                | 3846  | 4864         | 4673   | 5073         | 9340  | 4416        |
| Students with migration background (both parents foreign-born)                   |                |             |                     |       |              |        |              |       |             |
| Mean   | 520.8          | 527.1       | 504.5               | 464.9 | 476.6        | 458.4  | 430.9        | 494.3 | 466.6       |
| Std<br>Dev   | 108.4          | 97.7        | 116.0               | 105.7 | 112.2        | 90.2   | 101.3        | 109.8 | 98.3        |
| Me-<br>dian  | 530.2          | 530.6       | 513.2               | 464.4 | 488.5        | 453.9  | 425.0        | 495.8 | 465.8       |
| Nobs.  | 1054           | 3613        | 667                 | 559   | 57           | 539    | 712          | 513   | 445         |
| Share of students with migration background                                      |                |             |                     |       |              |        |              |       |             |
|  | 20.4           | 12.2        | 18.2                | 14.5  | 1.2          | 11.5   | 14.0         | 5.5   | 10.1        |
| Difference between national medians and median scores of immigrant stu-<br>dents |                |             |                     |       |              |        |              |       |             |
|  | 3.6            | -2.2        | 22.5                | 35.5  | 65.5         | 55.5   | 79.8         | 32.6  | 57.2        |

Notes: (Unweighted) Statistics based on PISA 2000 (OECD 2001). Nobs. = number of observations.

Somewhat surprising is the role of the UK, which performs similar to Australia, Canada and New Zealand. As mentioned above, dominant immigration flows from Western countries most probably contribute to this specific feature. The US, though a classical member of the traditional countries of immigration, is situated in a mid position. Despite effective border controls, illegal or unauthorized immigrants enter the US mainly across the Mexican border. In response to the growing undocumented population in the US, repeated amnesties led to legalisation of unauthorized migrants. According to an MPI documentation (MPI 2002), as of the year 2000, 28.4 million foreign-born (excluding most of the undocumented population) lived in the US, representing about 10 percent of the entire population. Some 51 percent of these foreign-born persons originate from Latin America (including Central America, South America and the Caribbean). These figures show that despite selective US Visa and Green Card policies, a

large share of migrants in the US consists of labour migrants similar to migrants in (continental) Europe.

**Table 2: International Socio-Economic Index of Parents (ISEI)**

|  | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA  | Fin-<br>land | France | Ger-<br>many | UK   | Swe-<br>den |
|--|----------------|-------------|---------------------|------|--------------|--------|--------------|------|-------------|
| All students   |                |             |                     |      |              |        |              |      |             |
| Mean   | 46.1           | 43.6        | 44.9                | 45.5 | 44.6         | 43.7   | 44.6         | 45.1 | 45.4        |
| Std<br>Dev   | 17.7           | 17.4        | 18.2                | 17.2 | 17.0         | 16.9   | 16.7         | 17.0 | 16.5        |
| Me-<br>dian  | 43             | 38          | 43                  | 43   | 40           | 39     | 40           | 40   | 43          |
| Nobs.  | 4939           | 28751       | 3523                | 3242 | 4770         | 4389   | 4934         | 8843 | 4313        |
| Students with migration background (both parents foreign-born)             |                |             |                     |      |              |        |              |      |             |
| Mean   | 46.3           | 47.5        | 49.8                | 42.7 | 42.8         | 38.5   | 36.9         | 47.3 | 42.0        |
| Std<br>Dev   | 18.3           | 18.3        | 19.1                | 18.0 | 17.2         | 16.0   | 13.7         | 17.5 | 16.9        |
| Me-<br>dian  | 43             | 44          | 50                  | 38   | 34           | 34     | 33           | 47   | 36          |
| Nobs.  | 1003           | 3499        | 625                 | 437  | 54           | 468    | 674          | 462  | 410         |
| Share of students with migration background (in percent)                   |                |             |                     |      |              |        |              |      |             |
|  | 20.3           | 12.2        | 17.7                | 13.5 | 1.1          | 10.7   | 13.7         | 5.2  | 9.5         |
| Difference between national median and median ISEI of foreign-born parents |                |             |                     |      |              |        |              |      |             |
|  | 0              | -6          | -7                  | 5    | 6            | 5      | 7            | -7   | 7           |

Notes: (Unweighted) Statistics based on PISA 2000 (OECD 2001). ISEI refers to the parental average. Nobs. = number of observations.

### 3. Econometric Estimation of Educational Gaps between Migrants and non-Migrants

In all countries, students from families with privileged high socioeconomic backgrounds performed better than students from low socioeconomic backgrounds. However, the impact of class differences is varying across countries. Table 3 shows the total or unconditional effect of ISEI on reading performance of students. This so called socioeconomic gradient<sup>10</sup> does

<sup>10</sup> The study of the relationships between children's outcomes and the socioeconomic status of their parents has a long tradition in the sociology and economics of education (Sewell and Hauser 1975, Bielby 1982, White 1982, Adler et al. 1994). Recent exam-

not account for other factors which are potentially responsible for the variance of the socioeconomic status within and between countries such as different shares of the immigrant population and their educational levels. Moreover, other factors such as the German system of differentiation by skill level which likewise would “explain” variation of school performance are not controlled for, because it might be just country-specific school systems which reinforce or weaken lack of social mobility, and because we are interested just in the overall effect of socioeconomic background in different groups of countries, though we are aware of several socio-demographic and institutional characteristics which contribute to this result (see, among others, Fertig, 2003, Wößmann, 2003).

Table 3 reveals that socioeconomic background has a smaller impact on reading achievement in Finland (1.06) and Canada (1.35) than in other countries (in statistical terms parameter estimates are highly significantly different from zero for all countries). High importance of social-class origin is found for the US (1.77), UK (1.86) and in particular Germany (2.20). Here, increasing ISEI by ten points from, say, 33 to 43 would improve the PISA reading score by 22 points, i.e. from roughly 475 to 497.<sup>11</sup> Our results suggest that achievement scores are less equivalent among students with different socioeconomic backgrounds in Germany than elsewhere.

However, it has to be taken into account that societies differ with respect to both the average level and the degree of inequality of socioeconomic status, a feature that changes with size and characteristics of the immigrant population. We thus compare country samples with and without migration background. As can be seen from the second panel of Table 2, also within the group of German students with both parents born abroad ISEI has a strong impact (1.99), but we also see that other countries even have larger effects from socioeconomic status within the group of migrants.

ples include applications to the International Adult Literacy Survey (IALS, performed in 1994, see Willms 1998) and also to PISA. OECD (2001) display the scatterplot of the socioeconomic gradient for the OECD area as a whole ([http://www.pisa.oecd.org/knowledge/chap8/f8\\_1.htm](http://www.pisa.oecd.org/knowledge/chap8/f8_1.htm)) and present country-specific results ([http://www.pisa.oecd.org/knowledge/annexb/t8\\_1.htm](http://www.pisa.oecd.org/knowledge/annexb/t8_1.htm)). Willms et al. (2003) give a recent survey and bibliography on the topic.

<sup>11</sup> In addition to ISEI, also ISEI-squared was tested as regressor of the PISA reading score. While ISEI-squared was significant for Germany, it was insignificant for all other countries. Calculating the slope parameter of the estimated equation  $369.1 + 3.74 \text{ ISEI} - 0.0154 \text{ ISEI}^2$  (R-squared = 0.132) at the German average of ISEI, 44.6, gives 2.36, i.e. an even somewhat higher impact than reported in Table 3.

**Table 3: Estimation of the total impact of parental socioeconomic status on students' reading achievement**

|                  | Aus-<br>tralia  | Can-<br>ada     | New<br>Zea-<br>land | USA             | Fin-<br>land    | France          | Ger-<br>many    | UK              | Swe-<br>den     |
|------------------|---|-----------------|---------------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| Explanatory var. | Dependent variable: PISA reading literacy score<br>Sample: all students |                 |                     |                 |                 |                 |                 |                 |                 |
| Constant         | 452.9<br>(3.87)   | 468.1<br>(1.47) | 464.6<br>(4.49)     | 425.8<br>(4.76) | 502.7<br>(3.45) | 433.7<br>(3.54) | 402.7<br>(3.85) | 445.9<br>(10.7) | 448.4<br>(3.85) |
| ISEI             | 1.70<br>(0.08)  | 1.35<br>(0.03)  | 1.51<br>(0.09)      | 1.77<br>(0.10)  | 1.06<br>(0.07)  | 1.69<br>(0.08)  | 2.20<br>(0.08)  | 1.86<br>(0.06)  | 1.53<br>(0.08)  |
| R-squared        | 0.087   | 0.061           | 0.070               | 0.091           | 0.043           | 0.103           | 0.131           | 0.103           | 0.079           |
| Nobs.            | 4939  | 28751           | 3523                | 3242            | 4770            | 4389            | 4934            | 8843            | 4313            |
|                  | Sub-sample: students with both parents foreign-born                     |                 |                     |                 |                 |                 |                 |                 |                 |
| Constant         | 457.4<br>(8.74)   | 461.1<br>(4.32) | 416.3<br>(11.6)     | 386.2<br>(12.3) | 478.2<br>(40.2) | 407.2<br>(10.3) | 362.6<br>(10.7) | 405.1<br>(12.8) | 435.9<br>(12.4) |
| ISEI             | 1.47<br>(0.18)  | 1.46<br>(0.08)  | 1.97<br>(0.22)      | 2.10<br>(0.27)  | 0.11<br>(0.88)  | 1.52<br>(0.25)  | 1.99<br>(0.27)  | 2.15<br>(0.25)  | 0.91<br>(0.27)  |
| R-squared        | 0.066   | 0.078           | 0.117               | 0.125           | 0.000           | 0.075           | 0.074           | 0.136           | 0.026           |
| Nobs.            | 1003  | 3499            | 625                 | 437             | 54              | 468             | 674             | 462             | 410             |
|                  | Sub-sample: students with both parents born in the country              |                 |                     |                 |                 |                 |                 |                 |                 |
| Constant         | 446.8<br>(4.95)   | 470.7<br>(1.65) | 472.9<br>(5.40)     | 434.2<br>(5.29) | 502.2<br>(3.50) | 446.9<br>(4.00) | 431.2<br>(4.12) | 448.7<br>(3.05) | 454.4<br>(4.29) |
| ISEI             | 1.82<br>(0.10)  | 1.28<br>(0.04)  | 1.46<br>(0.12)      | 1.71<br>(0.11)  | 1.09<br>(0.07)  | 1.55<br>(0.08)  | 1.85<br>(0.08)  | 1.83<br>(0.06)  | 1.50<br>(0.09)  |
| R-squared        | 0.102   | 0.053           | 0.068               | 0.089           | 0.046           | 0.093           | 0.112           | 0.100           | 0.078           |
| Nobs.            | 2870  | 22387           | 2210                | 2582            | 4565            | 3288            | 3854            | 7419            | 3425            |

Notes: Ordinary least squares (OLS) estimation based on PISA 2000 (OECD 2001). Nobs. = number of observations. (Asymptotic) Standard errors in parentheses.

The UK (2.15) as well as the US (2.10) both have estimates well above 2. Relatively low impact slopes exist for Sweden (0.91), Canada (1.46) and Australia (1.47) (Finland is disregarded because of its small share of migrants). It has to be kept in mind, however, that the estimated regression constant – representing the general skill level of migrants in respective countries – is much higher in Sweden (435.9), Canada (461.1) and Austra-

lia (457.4) than in Germany (362.6), the UK (405.1) and the US (386.2). Whereas this is expected for the traditional countries of immigration Canada and Australia, the result for Sweden suggests that reading scores are less dependent on different socioeconomic backgrounds here than elsewhere.

The last panel of Table 3 considers the sub-sample of students with both parents born in the country. It mainly consists of national citizens and thus represents the most homogeneous sample of all three cases studied in Table 3. As it is almost unaffected by immigration biases, it should give the most reliable estimate with respect to social mobility. Results confirm previous impressions. Smallest impacts are found for Finland (1.09) and Canada (1.28), high dependency on social status does exist in Australia (1.82), UK (1.83) and Germany (1.85).

OECD researchers found the language spoken at home to be a similarly or even more important variable than socioeconomic status: "Not surprisingly, students not speaking the majority language at home perform much less well than those who do and are much more likely to score among the lowest quarter of students in each country which can affect a country's average reading score significantly" (OECD 2001)<sup>12</sup>. Table 4 shows the large gap between students with the national language as their major language spoken at home and students from foreign language speaking backgrounds.<sup>13</sup> The language handicap is smaller in the UK (26.7 PISA points), Australia (30.8) and France (31.9), and highest in New Zealand (63.2) and Germany (57.4).<sup>14</sup> There might be different explanations for this heterogeneity of results. In the UK, non-English speaking migrants mainly come from European countries such as Italy, France and Germany (remember that the majority come from Ireland, the US and India). As English is the first foreign language taught in European schools, most foreign parents and children living in the UK are bilingual. For them, changing between the

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<sup>12</sup> <http://www.pisa.oecd.org/knowledge/chap6/h.htm>

<sup>13</sup> The variable 'national language spoken at home' is a dichotomous dummy variable, which takes the value 1 if the language of the national majority is spoken at home, and is valued 0 if not. Note that in Canada both English and French (Quebec) are 'national languages' such that 'language spoken at home' refers to the language of the respective region.

<sup>14</sup> Finland, too, shows a large difference (57.7) which is omitted from the discussion because of the minor importance of immigration for Finland.

language spoken at home and the language spoken at school is less a problem, though language problems accounting for PISA differences of around thirty points are still quite substantial. Similar to the UK is the situation in Australia, where selected migrants (from western countries) will more likely master the problem of bilingualism (note, however, that differences arising from the higher socioeconomic status of migrants are controlled for by including ISEI). The majority of migrants entering France originate from North Africa (Morocco, Algeria and Tunisia) where people are familiar with French. Thus, parents not speaking French to their children very likely come from Western European countries, mainly from Portugal, Spain and Italy<sup>15</sup> with all three nations being countries with languages of Latin origin such as the French language. For these families living in France, well functioning bilingualism of two related languages is not unlikely.

The situation in Germany differs strongly from that in Australia, France and UK. Here the large majority of immigrants without German citizenship living in Germany have neither a German-speaking nor Germanic background, nor a high socioeconomic status, nor originates from western countries. Almost two million of all 7.3 million non-Germans are Turkish citizens, and another almost two million migrants originate from Yugoslavia (respectively former Yugoslavia) and Eastern Europe.<sup>16</sup> The high gap between the reading performance of students from these groups and students who speak German at home shows that successful integration of migrants into the German society is highly dependent on whether or not they have a good command of the German language.

Given its nature as a traditional country of immigration, the high difference of educational achievements between those who speak English at

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<sup>15</sup> More than 1.1 million migrants without French passport living in France are from North Africa (Morocco: 504 thousand, Algeria: 478 thousand, Tunisia: 154 thousand). Other main countries of origin are Portugal (554 thousand), Turkey (208 thousand), Italy (202 thousand) and Spain (162 thousand). In France, the total of non-nationals amounted to 3.26 million in 1999 which corresponded to 5.6 percent of the French population (Source: SOPEMI 2002, OECD 2003).

<sup>16</sup> In 2002, 7.34 million citizens living in Germany (representing 8.9 percent of the resident population) did not have German citizenship. Looking at the stock of foreign population by country, the biggest groups stems from Turkey (1.91 million) and Yugoslavia, respectively former Yugoslavia (1.04 million). A further 891 thousand are of Eastern European origin, of which Polish citizens (317 thousand) and persons from countries constituting the former USSR (Russia, Ukraine, Belarus: 310 thousand) are the biggest groups. As regards migrants from Western countries, Italy (610 thousand) and Greece (359 thousand) are major sources. (Source: Statistisches Bundesamt, German Federal Statistical Office, see also MPI 2003).



home and those who do not found for New Zealand is somewhat surprising. However, New Zealand is distinctive among the four 'traditional countries of immigration' in the emphasis that is given to biculturalism and ethnic diversity. Fourteen per cent of New Zealanders identify themselves as being Maori (the indigenous population) and this ethnic group has the most prominent role in debates about the development of social and economic policy (Bedford 2003). In particular, there is a widening educational inequality which has left many Maori children left relatively worse off. (Blai-clock et al. 2002). As the Maori have their own language (and are encouraged to cultivate it), the reason for the large language-dependent gap most likely arises from the particular situation of Maori children.

Besides language problems (and effects controlled by ISEI), there are other problems due to lack of integration into society which are likewise responsible for the inferior performance of migrants in international PISA test scores. For instance, social capital of migrant families which falls behind that of natives, peer effects of migrants living in disadvantaged urban areas, as well as schooling systems not suitable for the needs of children from foreign cultural backgrounds, all have effects on the school performance of immigrant students. Estimations reported in Table 4 try to capture these residual differences between migrants and non-migrants which eventually stem from the fact that students are born abroad, or that father or mother are not born in the country of school attendance. Table 4 distinguishes between these effects by using three dichotomous dummy variables (which take the value 1 if logical expressions are correct and 0 if not). Total effects are summarized at the bottom of the table.

Students from all countries benefit from the fact that they were born and have grown up in the country. Estimated effects are positive and range between 8.70 (UK) and 23.9 (Australia) (though they are only weakly significant for New Zealand, Finland, the UK and Sweden). Thus, in addition to differences in PISA scores originating from the language spoken at home and the individual socioeconomic status, factors associated with the students' place of birth also play a role. Though interpretation can only be tentative at this stage, one might think of well-settled networks and more efficient integration (attendance of Kindergarten and primary schools, networks of parents) which have started in the very early stage of life and which contributed to better school performances of immigrant children in later years.

**Table 4: Estimation of the impact of parental socioeconomic status, country of birth, and language spoken at home on reading literacy**

|  | Aus-<br>tralia    | Can-<br>ada       | New<br>Zea-<br>land | USA               | Fin-<br>land      | France            | Ger-<br>many      | UK                | Swe-<br>den       |
|--|-------------------|-------------------|---------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|
| Dependent variable: PISA reading literacy score  |                   |                   |                     |                   |                   |                   |                   |                   |                   |
| Sample: all students   |                   |                   |                     |                   |                   |                   |                   |                   |                   |
| Constant   | 423.9**<br>(5.79) | 437.3**<br>(2.98) | 411.7**<br>(7.64)   | 377.2**<br>(7.71) | 425.9**<br>(12.0) | 371.0**<br>(9.36) | 345.3**<br>(6.35) | 404.5**<br>(8.17) | 398.4**<br>(6.71) |
| Student<br>born in the<br>country  | 23.9**<br>(5.32)  | 20.1**<br>(2.99)  | 10.9<br>(6.25)      | 17.2*<br>(7.99)   | 14.8<br>(10.5)    | 23.3**<br>(8.15)  | 16.5*<br>(7.64)   | 8.70<br>(5.44)    | 11.9<br>(6.62)    |
| Mother<br>born in the<br>country   | -15.0**<br>(3.86) | -12.0**<br>(2.24) | -6.92<br>(5.03)     | -1.58<br>(8.08)   | 4.36<br>(12.6)    | 7.72<br>(4.43)    | -5.51<br>(7.22)   | -1.90<br>(4.29)   | 3.72<br>(5.18)    |
| Father born<br>in the<br>country   | -7.43*<br>(3.67)  | -14.6**<br>(2.11) | -1.53<br>(4.87)     | -3.02<br>(7.52)   | 1.35<br>(11.0)    | 13.1**<br>(4.12)  | 18.3**<br>(6.32)  | 10.5*<br>(4.42)   | 2.54<br>(5.16)    |
| National<br>language<br>spoken at<br>home  | 30.8**<br>(4.73)  | 40.8**<br>(3.08)  | 63.2**<br>(7.46)    | 46.5**<br>(7.57)  | 57.7**<br>(15.5)  | 31.9**<br>(8.20)  | 57.4**<br>(7.67)  | 26.7**<br>(7.68)  | 39.1**<br>(8.33)  |
| ISEI   | 1.68**<br>(0.08)  | 1.33**<br>(0.03)  | 1.48**<br>(0.09)    | 1.68**<br>(0.10)  | 1.09**<br>(0.07)  | 1.57**<br>(0.08)  | 1.86**<br>(0.08)  | 1.86**<br>(0.06)  | 1.49**<br>(0.08)  |
| R-squared  | 0.102             | 0.074             | 0.096               | 0.116             | 0.055             | 0.117             | 0.168             | 0.104             | 0.099             |
| Nobs.  | 4798              | 26657             | 3262                | 3181              | 4505              | 4130              | 4443              | 8472              | 4156              |
| Total effect of places of birth: herself, father and mother not born in the<br>country |                   |                   |                     |                   |                   |                   |                   |                   |                   |
|  | 1.4               | -6.5              | 2.4                 | 12.6              | 20.5              | 44.0              | 29.3              | 17.3              | 18.2              |
| Foreign places of birth + foreign language spoken at home                              |                   |                   |                     |                   |                   |                   |                   |                   |                   |
|  | 32.2              | 34.3              | 65.6                | 59.1              | 78.2              | 75.9              | 86.7              | 44.0              | 57.3              |

Notes: Ordinary least squares (OLS) estimation based on PISA 2000 (OECD 2001). Nobs. = number of observations. (Asymptotic) Standard errors in parentheses. \*, \*\* denotes significance at the 5 percent, and 1 percent level, respectively.

Whereas there is no evident statistical discrimination between countries of immigration and European countries with respect to the country of birth of students, the situation changes when the place of birth of parents comes into play. While within all traditional countries of immigration students of parents born abroad achieve better reading literacy scores than students whose parents are born in the country, children of parents born in the country perform better than children from foreign-born parents in Europe. However, the general impression is that most results turn out to be insignificant which is not surprising given the presence of the highly important impact

of parents' ISEI in all regressions. Thus, it is interesting to focus on significant results. We find that in Australia and Canada both parents are associated with negative effects on PISA scores when both are born in the country, conversely there are positive effects if they are born abroad. Thinking of indirect effects arising from multipliers of social interaction (see, for instance, Glaeser et al. 2002), this result might be due to some positive externalities from networks within the group of highly educated and highly skilled immigrants typical for these countries. This contrasts with Germany, France and UK where students perform better when their parents (in particular their father) is native. As impacts from mothers are insignificant, in Europe positive externalities from integration seem to depend on the person whose socioeconomic status is highest within the family which coincides with the father for all three countries under consideration (see Baumert and Schuemer 2001, p. 348, for ISEI dependent on gender).

Summing up, we observe that the marginal effect of place of birth significantly matters for France (44 points) and Germany (29.3), and to a lesser extent for the UK (17.3) and Sweden (18.2), whereas the effects are much smaller or even negative for Australia (1.4), Canada (-6.5) and New Zealand (2.4), i.e. countries which select immigration according to well-defined criteria. Adding the more important impact from the language spoken at home, the gap between non-migrants and migrants (here defined as students born abroad, with both parents born abroad, and foreign language spoken at home) is widening dramatically. In Germany, the effect amounts to 86.7 points which is even more than the difference between the OECD average (500) and the Mexican score (422). Also French (75.9) and Finnish (78.2) migration gaps are quite high, followed by the difference in New Zealand (65.6) which is mainly caused by language problems. Least important differences show up for Australia (32.2) and Canada (34.3). Moreover, as positive net effects in Australia and Canada arise due to externalities associated with the foreign birthplace of children, the effect will almost vanish when foreign parents have children born in these countries (Australia:  $32.2 - 20.1 = 12.1$ , Canada: 14.2), whereas the migrant malus remains highly relevant for Germany (70.2) and France (52.6).

Given the consideration of migration status and language spoken at home, is there any change of country-specific socioeconomic gradients? Comparing Table 3 and Table 4 reveals that curves have become somewhat flatter when controlling for migration issues, but only the change in Germany is statistically significant. Notwithstanding, Germany still has the steepest socioeconomic gradient, being now on a par with the United Kingdom (1.86). Flatter curves do exist for Sweden (1.49) and for Canada (1.33)

as well as for New Zealand (1.48), with the latter two countries starting from a higher level (see estimated constants, which are 437.3 for Canada, 411.7 for New Zealand and 398.4 for Sweden). Again, the flattest gradient is confirmed for Finland (1.09).

#### 4. Calculation of Scenarios Dependent on the Presence or Absence of Migration Backgrounds

Previous results have shown that PISA scores can differ dramatically between migrants and non-migrants within countries. However, estimated gaps such as, for instance, the one for Germany are still underestimated because the relevant socioeconomic status of migrants is lower than the average of all observations which underlie respective OLS regressions and differences deduced from them, whereas migration effects for Canada and New Zealand are overestimated because here ISEI of migrants exceeds that of natives (see Table 2). We therefore run three different scenarios:

- I. Non-migrants (natives): Student is born in the country, both parents are born in the country, the national language is spoken at home
- II. Non-integrated migrants (minor knowledge of national language): Student is born in a foreign country, both parents are born in a foreign country, a foreign language is spoken at home
- III. Integrated migrants (knowledge of national language): Student is born in a foreign country, both parents are born in a foreign country, the national language is spoken at home

All scenarios are based on regressions performed above, i.e. on

$$\begin{aligned} \text{PISA} = & c + \alpha(\text{Foreign\_born}=0) + \beta(\text{Father\_foreign\_born}=0) \\ & + \gamma(\text{Mother\_foreign\_born}=0) + \delta(\text{Language\_at\_home}=\text{national}) \\ & + \lambda(\text{ISEI}) + \text{residual} \end{aligned}$$

Imputation of PISA scores according to scenarios I, II and III requires mean ISEI of corresponding sub-samples:

$$\begin{aligned} \text{PISA\_I} &= \hat{c} + \hat{\alpha} + \hat{\beta} + \hat{\gamma} + \hat{\delta} + \hat{\lambda}(\text{ISEI\_I}), \\ \text{PISA\_II} &= \hat{c} + \hat{\lambda}(\text{ISEI\_II}), \\ \text{PISA\_III} &= \hat{c} + \hat{\delta} + \hat{\lambda}(\text{ISEI\_III}), \end{aligned}$$

where

ISEI<sub>i</sub>, i= I, II, III = mean of sub-samples I, II, III.<sup>17</sup>

Before results from different scenarios are presented in Table 6, Table 5 informs about the socioeconomic status within sub-samples defined by PISA\_I, PISA\_II and PISA\_III. In Australia, Canada and New Zealand and also in UK ISEI of students from foreign-born parents is higher than ISEI from students born in the country, even when the language spoken at home is not identical to the national language, whereas ISEI is smaller for all other countries (note that previous comparisons in Table 2 did not impose any restriction with respect to command of languages). In particular Germany, France, Sweden and the US show high differences between PISA\_I and PISA\_II. Having foreign-born parents but speaking the national language at home instead of the foreign language is correlated with a higher ISEI in particular in New Zealand, USA and France, whereas it is smaller in UK.<sup>18</sup>

Variation in socioeconomic status and dissimilarities in the usage of national languages translate into imputed (fitted) values presented in Table 6. When comparing PISA scores of the PISA\_I group of ‘natives’ (which not necessarily implies national citizenship in respective countries) with results of total samples (confer Table 1), we observe a narrowed margin, though we still observe Finland and the traditional countries of immigration (except USA) in leading positions. However, Germany, France and USA, but also New Zealand, would all have improved by more than 10 points when only groups of natives speaking the national language at home (which is not necessarily the case for Maori, i.e. indigenous natives from New Zealand) would have taken part in PISA 2000. Looking at the gap of the most disadvantaged group II (foreign parents, foreign language) with respect to the ‘native’ group I (born in the country, national language), we observe that the difference amounts to 105.7 in Germany. This is the highest ‘migration gap’ among all countries under comparison. Somewhat lower but still remarkable are differences within other host countries of labour migration: France (83.8), Sweden (63.6) and USA (69.7). Here the US, though belonging to the traditional countries of immigration, needs to be included because it is concerned with typical problems of labour migration, in par-

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<sup>17</sup> As OLS refers to deviations from mean values, we only calculate fitted values based on means.

<sup>18</sup> Note, however, that statistics of PISA\_II are only based on 60 observations for UK (see Table 6).

ticular with (illegal) migration streams entering across the Mexican border. In contrast to these results, differences in Australia (27.5) and Canada (25.5) are much smaller.

**Table 5: Comparison of ISEI for different migration/ non-migration scenarios**

|                   | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA  | Fin-<br>land | France | Ger-<br>many | UK   | Swe-<br>den |
|-------------------|----------------|-------------|---------------------|------|--------------|--------|--------------|------|-------------|
|                   | Mean           |             |                     |      |              |        |              |      |             |
| All stu-<br>dents | 46.1           | 43.6        | 44.9                | 45.5 | 44.6         | 43.7   | 44.6         | 45.1 | 45.4        |
| PISA_I            | 45.7           | 42.4        | 43.0                | 46.1 | 44.4         | 44.2   | 46.0         | 44.7 | 45.7        |
| PISA_II           | 48.5           | 49.0        | 51.7                | 39.8 | 40.9         | 39.2   | 35.7         | 54.1 | 41.5        |
| PISA_III          | 48.6           | 50.8        | 57.3                | 48.0 | 45.1         | 43.5   | 38.2         | 46.2 | 43.9        |
|                   | Median         |             |                     |      |              |        |              |      |             |
| All stu-<br>dents | 43             | 38          | 43                  | 43   | 40           | 39     | 40           | 40   | 43          |
| PISA_I            | 43             | 35          | 40                  | 43   | 40           | 40     | 43           | 40   | 43          |
| PISA_II           | 46             | 50          | 51                  | 33   | 33           | 34     | 33           | 53.5 | 34          |
| PISA_III          | 44             | 52          | 56                  | 44.5 | 38           | 39     | 33           | 39   | 40.5        |

Notes: (Unweighted) Statistics based on PISA 2000 (OECD 2001). ISEI refers to the parental average.

Use of the national language at home instead of a foreign language would improve the reading literacy score of students whose parents are born abroad. Most significant upward shifts (PISA\_III vs. PISA\_II) can be observed for New Zealand (71.5), Germany (61.9) and the US (60.3). Children from migrants in New Zealand strongly benefit from speaking the majority language at home, and also in Australia and Canada imputed PISA\_III scores are even above those of the group of natives represented by PISA\_I. Obviously, within these countries PISA\_III mainly consists of children of highly educated and high-skilled business migrants, whereas in countries like Germany and France, though assimilation of labour migrants (in terms of practising the national language) would lead to a highly significant improvement of reading achievements, school performance of immigrants would still clearly lag behind that of native inhabitants.

**Table 6: Comparison of different migration/ non-migration scenarios: imputation of PISA scores**

|                   | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA   | Fin-<br>land | France | Ger-<br>many | UK    | Swe-<br>den |
|-------------------|----------------|-------------|---------------------|-------|--------------|--------|--------------|-------|-------------|
| PISA_I<br>Nobs.   | 532.9          | 528.0       | 540.9               | 513.8 | 552.7        | 516.4  | 517.4        | 531.4 | 523.9       |
| PISA_I<br>Nobs.   | 2827           | 21306       | 2113                | 2748  | 4381         | 3319   | 3803         | 7467  | 3357        |
| PISA_II<br>Nobs.  | 505.4          | 502.5       | 488.1               | 444.1 | 470.7        | 432.6  | 411.7        | 504.8 | 460.3       |
| PISA_II<br>Nobs.  | 325            | 1007        | 230                 | 193   | 37           | 49     | 205          | 60    | 177         |
| PISA_III<br>Nobs. | 536.4          | 545.6       | 559.6               | 504.4 | 532.9        | 471.3  | 473.6        | 516.9 | 503.1       |
| PISA_III<br>Nobs. | 197            | 519         | 184                 | 67    | 9            | 30     | 106          | 110   | 33          |

Notes: Imputations are based on Table 4 and on sub-sample means of ISEI presented in Table 5. Nobs. = number of observations. See the text for details.

## 5. Results for Mathematical and Scientific Literacy

Calculations and estimation procedures have been replicated for OECD data sets on mathematical and scientific literacy. Results are presented in the Appendix. They strongly confirm our findings based on reading literacy. As regards effects from the simple fact that parents and students are born abroad (given that we control for language and socioeconomic background), which we interpret as consequences of lacking integration, we again observe that these effects are highest in France, Germany and (to a smaller degree) in Sweden (see ‘total effects of place of birth’ in Tables 4, M3 and S3), and that in particular for Germany and France school problems in either discipline are dramatically reinforced by language problems (see bottom lines of same tables). The high socioeconomic gradient is confirmed for Germany (though it is somewhat smaller for scientific literacy, see Table S3), but it turns out that besides the UK the US society also seems to be characterized by a relatively high degree of social immobility. This result holds particularly for students with migration background where the parameter estimate on ISEI (i.e. the socioeconomic gradient) for both the UK and US is above two in Tables M2 and S2 (see Appendix). The US result challenges the popular view of high social mobility (“from dishwasher to millionaire”) in the US.

Summing up, results based on mathematical and scientific literacy confirm the grouping of countries discussed before. Large differences in educational achievements can be explained by the presence or absence of mi-

gration backgrounds, combined with socioeconomic background and potential language problems of immigrants. Using these criteria we have a first cluster consisting of France, Germany and Sweden (though results for Sweden are somewhat less significant), while Australia, Canada and New Zealand differ from the first cluster with respect to national PISA scores but also with respect to population characteristics of migrants. The US and UK cannot be identified as unambiguously belonging to one or the other group, though all in all the US might be more affected by problems of labour migration (like most European countries), whereas the UK is somewhat closer to the situation of traditional countries of immigration due to the large share of West-European labour migrants.

## **6. Summary and Conclusions**

Results of the Programme for International Student Assessment (PISA) revealed that the school performance of 15-year-olds seems to be dependent on whether or not participants live in traditional countries of immigration (namely Australia, Canada or New Zealand). Only teenagers from Finland had a significantly better score than students from this group of nations. Some other European countries such as France and Germany but also the US performed significantly worse than these top ranking countries. In response to these results, there is an ongoing discussion about the reasons of differing average proficiency levels across countries.

The purpose of this article is to evaluate the importance of social class, migration background and command of national languages for the PISA school performance of teenagers living in European countries (France, Finland, Germany, United Kingdom, and Sweden) and traditional countries of immigration. Whereas mainly France, Germany and Sweden are considered as typical countries concerned with labour migration, Australia, Canada and New Zealand mainly select business migrants according to current national needs for high-skilled workers. The situation in the US is different because of its high share of labour migrants entering across the Mexican border.

In keeping with our aims, we present several country-by-country comparisons. Some initial descriptive analysis shows that the key difference between the traditional countries of immigration, Australia, Canada and New Zealand, but also the UK, on the one hand, and France, Germany and Sweden on the other hand is the social background of immigrant families. While within traditional countries of immigration and the UK the socioeconomic status of migrants (measured by ISEI) even exceeds that of na-



tional averages, ISEI values of natives exceed that of inhabitants with a migration background in France, Germany, Sweden and the US.

Our econometric results show that the impact curves of the socioeconomic status of parents on the school performance of their children differ strongly across nations, with the steepest rises found for Germany, the UK and US, whereas the socioeconomic gradient appears to be smaller in Scandinavian countries and in Canada. These results are important for comparing chances of social mobility of immigrants across countries. Within countries of labour migration as in Germany, for instance, where the large majority of citizens without German citizenships have a poor socioeconomic background, the consequence of the high socioeconomic gradient is that immigrants are trapped by lack of social mobility and more probably keep within lowest social classes.

Educational inequalities between such social classes can be enormous, as can be seen from the difference in PISA reading scores of students with and without migration background. Calculation of different scenarios shows that the gap of the most disadvantaged migration group (foreign parents, foreign language spoken at home) with respect to the group of natives (students born in the country, national language spoken at home) amounts to 105.7 PISA score points for Germany, 83.8 for France, 69.7 for the US and 63.6 for Sweden. In contrast to these results, differences in Australia (27.5) and Canada (25.5) are much smaller.

However, our empirical results also show that a key for catching up is the language spoken at home. Reading proficiency scores of migrant students improved significantly when the language spoken at home is the national language as opposed to some foreign language. Our results suggest that a substantial share of the ‘migration gap’ can be reduced within countries of labour migration (in Germany, the upward shift would amount to 61.9 points of the aforementioned gap of 105.7), whereas practising national languages at home would even lead to the outperformance of native students in traditional countries of immigration.

The high gap between the school performance of immigrant students who speak national languages at home and those who do not shows that successful integration of labour migrants into European societies is highly dependent on whether or not they have a good command of national languages. Educational policies in countries like Germany should focus on integration of immigrant children in schools and preschools, with particular emphasis on language skills at the early stage of childhood. Improved school performance, higher labour productivity and lower social costs in

later stages of life would make such investments in human and social capital highly profitable.

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## Appendix

### Mathematics

**Table M1: Comparison of mean MATHEMATICAL literacy scores**

|  | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA    | Fin-<br>land | France | Ger-<br>many | UK     | Swe-<br>den |
|--|----------------|-------------|---------------------|--------|--------------|--------|--------------|--------|-------------|
| All students   |                |             |                     |        |              |        |              |        |             |
| Mean   | 530.85         | 524.93      | 537.53              | 482.56 | 537.99       | 517.12 | 500.09       | 529.52 | 510.06      |
| Std<br>Dev   | 93.39          | 84.52       | 98.56               | 97.52  | 79.29        | 89.33  | 99.70        | 92.22  | 92.94       |
| Me-<br>dian  | 535.74         | 526.58      | 543.02              | 485.39 | 539.81       | 522.03 | 505.28       | 534.24 | 513.6       |
| Nobs.  | 2859           | 16489       | 2048                | 2135   | 2703         | 2597   | 2830         | 5195   | 2464        |
| Students with migration background (both parents foreign-born)                   |                |             |                     |        |              |        |              |        |             |
| Mean   | 531.40         | 527.90      | 525.19              | 456.33 | 493.97       | 477.51 | 434.95       | 498.12 | 457.46      |
| Std<br>Dev   | 93.73          | 85.92       | 106.95              | 97.38  | 119.19       | 89.68  | 99.04        | 99.28  | 96.71       |
| Me-<br>dian  | 536.75         | 529.46      | 535.79              | 454.00 | 508.52       | 483.26 | 431.95       | 509.82 | 459.22      |
| Nobs.  | 607            | 2015        | 380                 | 298    | 29           | 278    | 402          | 281    | 250         |
| Share of students with migration background (in percent)                         |                |             |                     |        |              |        |              |        |             |
|  | 21.23          | 12.22       | 18.55               | 13.96  | 1.07         | 10.70  | 14.20        | 5.41   | 10.15       |
| Difference between national medians and median scores of immigrant stu-<br>dents |                |             |                     |        |              |        |              |        |             |
|  | -1.01          | -2.88       | 7.23                | 31.39  | 31.29        | 38.77  | 73.33        | 24.42  | 54.38       |

Notes: (Unweighted) Statistics based on PISA 2000 (OECD 2001). Nobs. = number of observations.

**Table M2: Estimation of the total impact of parental socioeconomic status on students' MATHEMATICAL achievement**

|                      | Aus-<br>tralia   | Can-<br>ada       | New<br>Zea-<br>land | USA                | Fin-<br>land       | France             | Ger-<br>many       | UK                 | Swe-<br>den        |
|----------------------|--|-------------------|---------------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
| Explana<br>tory var. | Dependent variable: PISA mathematical literacy score<br>Sample: all students |                   |                     |                    |                    |                    |                    |                    |                    |
| Con-<br>stant        | 458.1**<br>(4.56)  | 478.5**<br>(1.74) | 482.7**<br>(5.48)   | 410.5**<br>(6.01)  | 497.4**<br>(4.16)  | 462.3**<br>(4.71)  | 411.7**<br>(4.92)  | 459.1**<br>(3.41)  | 436.3**<br>(5.23)  |
| ISEI                 | 1.66**<br>(0.09)   | 1.11**<br>(0.03)  | 1.33**<br>(0.11)    | 1.81**<br>(0.12)   | 0.93**<br>(0.08)   | 1.36**<br>(0.10)   | 2.05**<br>(0.10)   | 1.68**<br>(0.07)   | 1.67**<br>(0.10)   |
| R-<br>squared        | 0.105  | 0.053             | 0.066               | 0.107              | 0.042              | 0.070              | 0.126              | 0.103              | 0.089              |
| Nobs.                | 2740   | 15972             | 1960                | 1788               | 2644               | 2435               | 2738               | 4902               | 2406               |
|                      | Sub-sample: students with both parents foreign-born                          |                   |                     |                    |                    |                    |                    |                    |                    |
| Con-<br>stant        | 472.4**<br>(9.70)  | 476.0**<br>(5.24) | 446.2**<br>(14.71)  | 378.1**<br>(15.51) | 515.9**<br>(50.31) | 437.9**<br>(14.75) | 374.6**<br>(14.15) | 413.8**<br>(15.60) | 405.9**<br>(16.34) |
| ISEI                 | 1.38**<br>(0.20)   | 1.13**<br>(0.10)  | 1.71**<br>(0.26)    | 2.03**<br>(0.32)   | -0.20<br>(1.09)    | 1.27*<br>(0.35)    | 1.77**<br>(0.36)   | 2.05**<br>(0.31)   | 1.33**<br>(0.35)   |
| R-<br>squared        | 0.07   | 0.059             | 0.102               | 0.145              | 0.001              | 0.050              | 0.060              | 0.148              | 0.059              |
| Nobs.                | 577  | 1951              | 355                 | 228                | 28                 | 239                | 381                | 251                | 232                |
|                      | Sub-sample: students with both parents born in the country                   |                   |                     |                    |                    |                    |                    |                    |                    |
| Con-<br>stant        | 450.1**<br>(6.04)  | 478.0**<br>(1.95) | 487.8**<br>(6.77)   | 418.0**<br>(6.68)  | 497.0**<br>(4.25)  | 477.5**<br>(5.31)  | 441.1**<br>(5.28)  | 461.9**<br>(3.69)  | 442.6**<br>(5.76)  |
| ISEI                 | 1.79**<br>(0.12)   | 1.09**<br>(0.04)  | 1.35**<br>(0.14)    | 1.75**<br>(0.13)   | 0.95**<br>(0.08)   | 1.19**<br>(0.11)   | 1.70**<br>(0.10)   | 1.67**<br>(0.07)   | 1.66**<br>(0.11)   |
| R-<br>squared        | 0.118  | 0.050             | 0.066               | 0.103              | 0.043              | 0.057              | 0.108              | 0.102              | 0.092              |
| Nobs.                | 1574   | 12434             | 1205                | 1441               | 2524               | 1842               | 2122               | 4107               | 1924               |

Notes: Ordinary least squares (OLS) estimation based on PISA 2000 (OECD 2001). Nobs. = number of observations. (Asymptotic) Standard errors in parentheses. \*, \*\*) denotes significance at the 5 percent, and 1 percent level, respectively.

**Table M3: Estimation of the impact of parental socioeconomic status, country of birth, and language spoken at home on MATHEMATICAL literacy**

|  | Aus-<br>tralia         | Canada            | New<br>Zea-<br>land | USA               | Fin-<br>land       | France             | Ger-<br>many       | UK                | Swe-<br>den        |
|--|------------------------|-------------------|---------------------|-------------------|--------------------|--------------------|--------------------|-------------------|--------------------|
| Dependent variable: PISA mathematical literacy score                                   |                        |                   |                     |                   |                    |                    |                    |                   |                    |
| Sample: all students   |                        |                   |                     |                   |                    |                    |                    |                   |                    |
| Constant   | 445.3**<br>(6.78)      | 467.5**<br>(3.55) | 455.7**<br>(9.63)   | 364.8**<br>(10.1) | 452.2**<br>(14.5)  | 399.0**<br>(12.64) | 356.0**<br>(8.65)  | 423.6**<br>(9.83) | 385.2**<br>(9.04)  |
| Student<br>born in<br>the coun-<br>try   | 18.63**<br>(6.21)      | 8.22*<br>(3.61)   | 5.42<br>(7.69)      | 19.11<br>(10.35)  | -1.32<br>(12.99)   | 39.26**<br>(11.27) | -2.30<br>(9.94)    | -7.50<br>(6.53)   | 6.53<br>(9.09)     |
| Mother<br>born in<br>the coun-<br>try  | -7.7<br>(4.51)         | -6.45*<br>(2.71)  | 4.01<br>(6.29)      | -15.98<br>(10.63) | -0.08<br>(14.70)   | 12.88*<br>(6.04)   | 0.72<br>(9.37)     | -1.82<br>(5.18)   | 17.04*<br>(7.19)   |
| Father<br>born in<br>the coun-<br>try  | -<br>13.06**<br>(4.36) | -3.46<br>(2.53)   | -3.04<br>(6.07)     | 13.62<br>(9.55)   | -12.17<br>(13.52)  | 12.53*<br>(5.51)   | 25.18**<br>(8.53)  | 19.84**<br>(5.36) | 7.28<br>(6.96)     |
| National<br>language<br>spoken at<br>home  | 16.4**<br>(5.55)       | 15.05**<br>(3.67) | 28.78**<br>(9.14)   | 38.93**<br>(9.33) | 58.97**<br>(17.76) | 12.70<br>(11.14)   | 61.06**<br>(10.26) | 27.35**<br>(9.18) | 29.11**<br>(10.98) |
| ISEI   | 1.63**<br>(0.09)       | 1.10**<br>(0.03)  | 1.35**<br>(0.11)    | 1.72**<br>(0.12)  | 0.96**<br>(0.89)   | 1.23**<br>(0.10)   | 1.72**<br>(0.10)   | 1.69**<br>(0.07)  | 1.63**<br>(0.10)   |
| R-squared  | 0.113                  | 0.056             | 0.073               | 0.128             | 0.048              | 0.083              | 0.163              | 0.107             | 0.113              |
| Nobs.  | 2657                   | 14819             | 1807                | 1752              | 2494               | 2292               | 2473               | 4692              | 2329               |
| Total effect of places of birth: herself, father and mother not born in the<br>country |                        |                   |                     |                   |                    |                    |                    |                   |                    |
|  | -2.12                  | -1.69             | 6.39                | 16.75             | -13.58             | 64.69              | 23.62              | 10.50             | 30.86              |
| Foreign places of birth + foreign language spoken at home                              |                        |                   |                     |                   |                    |                    |                    |                   |                    |
|  | 14.28                  | 13.36             | 35.17               | 55.69             | 45.38              | 77.39              | 84.68              | 37.86             | 59.98              |

Notes: Ordinary least squares (OLS) estimation based on PISA 2000 (OECD 2001). Nobs. = number of observations. (Asymptotic) Standard errors in parentheses. \*, \*\* denotes significance at the 5 percent, and 1 percent level, respectively.

**Table M4: Comparison of different migration/ non-migration scenarios: imputation of MATHEMATICAL literacy scores**

|                       | Australia | Canada | New Zealand | USA    | Finland | France | Germany | UK     | Sweden |
|-----------------------|-----------|--------|-------------|--------|---------|--------|---------|--------|--------|
| PISA_I<br>Nobs.       | 534.52    | 527.65 | 548.97      | 499.87 | 540.40  | 530.69 | 519.81  | 536.50 | 519.33 |
| PISA_I<br>Nobs.       | 1534      | 11822  | 1153        | 1526   | 2426    | 1861   | 2101    | 4133   | 1890   |
| PISA_II<br>Nobs. PI-  | 525.44    | 522.39 | 529.20      | 433.17 | 492.17  | 446.91 | 416.45  | 519.22 | 455.32 |
| SA_II<br>Nobs. PI-    | 188       | 581    | 137         | 95     | 22      | 28     | 102     | 33     | 102    |
| PISA_III<br>Nobs. PI- | 539.58    | 537.45 | 563.11      | 486.77 | 554.76  | 462.45 | 478.80  | 524.66 | 493.01 |
| SA_III<br>Nobs. PI-   | 108       | 285    | 99          | 38     | 3       | 20     | 57      | 64     | 22     |

Notes: Imputations are based on Table M3 and on sub-sample means of ISEI calculated from the OECDdata base on mathematical literacy. Nobs. = number of observations. See the text for details.



## Sciences

**Table S1: Comparison of mean SCIENTIFIC literacy scores**

|  | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA    | Fin-<br>land | France | Ger-<br>many | UK     | Swe-<br>den |
|--|----------------|-------------|---------------------|--------|--------------|--------|--------------|--------|-------------|
| All students   |                |             |                     |        |              |        |              |        |             |
| Mean   | 524.97         | 520.79      | 526.45              | 490.53 | 538.48       | 500.46 | 495.54       | 528.65 | 511.47      |
| Std<br>Dev   | 98.30          | 88.84       | 100.10              | 99.56  | 86.35        | 103.56 | 101.68       | 100.25 | 93.54       |
| Me-<br>dian  | 529.82         | 523.31      | 533.23              | 489.93 | 540.51       | 503.49 | 501.1        | 530.87 | 517.21      |
| Nobs.  | 2860           | 16488       | 2029                | 2129   | 2710         | 2592   | 2855         | 5179   | 2444        |
| Students with migration background (both parents foreign-born)                   |                |             |                     |        |              |        |              |        |             |
| Mean   | 518.56         | 516.51      | 506.42              | 458.33 | 468.08       | 438.38 | 422.52       | 501.53 | 454.50      |
| Std<br>Dev   | 104.27         | 92.20       | 108.32              | 98.64  | 98.01        | 98.07  | 100.29       | 105.51 | 95.01       |
| Me-<br>dian  | 524.55         | 520.67      | 510.87              | 448.92 | 455.95       | 429.49 | 418.21       | 504.14 | 450.62      |
| Nobs.  | 555            | 1960        | 370                 | 312    | 32           | 291    | 392          | 286    | 241         |
| Share of students with migration background (in percent)                         |                |             |                     |        |              |        |              |        |             |
|  | 19.41          | 11.89       | 18.24               | 14.65  | 1.18         | 11.23  | 13.73        | 5.52   | 9.86        |
| Difference between national medians and median scores of immigrant stu-<br>dents |                |             |                     |        |              |        |              |        |             |
|  | 5.27           | 2.64        | 22.36               | 41.01  | 84.56        | 74.00  | 82.90        | 26.74  | 66.59       |

Notes: (Unweighted) Statistics based on PISA 2000 (OECD 2001). Nobs. = number of observations.

**Table S2: Estimation of the total impact of parental socioeconomic status on students' SCIENTIFIC achievement**

|                  | Aus-<br>tralia   | Can-<br>ada       | New<br>Zea-<br>land | USA                | Fin-<br>land       | France             | Ger-<br>many       | UK                 | Swe-<br>den        |
|------------------|--|-------------------|---------------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
| Explanatory var. | Dependent variable: PISA scientific literacy score<br>Sample: all students |                   |                     |                    |                    |                    |                    |                    |                    |
| Con-<br>stant    | 465.2**<br>(4.93)  | 469.7**<br>(1.81) | 458.3**<br>(5.59)   | 420.6**<br>(6.04)  | 496.8**<br>(4.61)  | 420.4**<br>(5.40)  | 406.4**<br>(5.12)  | 448.7**<br>(3.72)  | 449.1**<br>(5.32)  |
| ISEI             | 1.40**<br>(0.10)   | 1.23**<br>(0.03)  | 1.62**<br>(0.11)    | 1.77**<br>(0.12)   | 0.95**<br>(0.09)   | 1.93**<br>(0.11)   | 2.06**<br>(0.10)   | 1.89**<br>(0.07)   | 1.42**<br>(0.11)   |
| R-<br>squared    | 0.066  | 0.059             | 0.091               | 0.101              | 0.035              | 0.105              | 0.118              | 0.107              | 0.064              |
| Nobs.            | 2736   | 15977             | 1954                | 1800               | 2662               | 2428               | 2773               | 4925               | 2391               |
|                  | Sub-sample: students with both parents foreign-born                        |                   |                     |                    |                    |                    |                    |                    |                    |
| Con-<br>stant    | 461.8**<br>(11.78)   | 453.2**<br>(5.46) | 417.7**<br>(14.36)  | 348.7**<br>(14.57) | 431.5**<br>(53.71) | 396.1**<br>(15.65) | 343.0**<br>(14.42) | 404.6**<br>(16.84) | 447.6**<br>(16.35) |
| ISEI             | 1.34**<br>(0.23)   | 1.40**<br>(0.10)  | 1.96**<br>(0.26)    | 2.72**<br>(0.31)   | 0.85<br>(1.15)     | 1.19*<br>(0.37)    | 2.27**<br>(0.36)   | 2.20**<br>(0.32)   | 0.31<br>(0.37)     |
| R-<br>squared    | 0.056  | 0.083             | 0.131               | 0.223              | 0.019              | 0.039              | 0.093              | 0.150              | 0.003              |
| Nobs.            | 531  | 1891              | 350                 | 252                | 30                 | 255                | 373                | 260                | 223                |
|                  | Sub-sample: students with both parents born in the country                 |                   |                     |                    |                    |                    |                    |                    |                    |
| Con-<br>stant    | 460.2**<br>(6.20)  | 473.0**<br>(2.04) | 468.0**<br>(6.70)   | 438.0**<br>(6.80)  | 497.2**<br>(4.67)  | 434.6**<br>(6.02)  | 440.9**<br>(5.52)  | 450.2**<br>(4.05)  | 456.7**<br>(5.92)  |
| ISEI             | 1.54**<br>(0.12)   | 1.18**<br>(0.04)  | 1.55**<br>(0.14)    | 1.55**<br>(0.13)   | 0.97**<br>(0.09)   | 1.82**<br>(0.12)   | 1.62**<br>(0.11)   | 1.89**<br>(0.08)   | 1.38**<br>(0.12)   |
| R-<br>squared    | 0.084  | 0.053             | 0.084               | 0.081              | 0.037              | 0.102              | 0.088              | 0.107              | 0.063              |
| Nobs.            | 1596   | 12492             | 1240                | 1425               | 2554               | 1827               | 2153               | 4133               | 1901               |

Notes: Ordinary least squares (OLS) estimation based on PISA 2000 (OECD 2001). Nobs. = number of observations. (Asymptotic) Standard errors in parentheses. \*, \*\*) denotes significance at the 5 percent, and 1 percent level, respectively.

**Table S3: Estimation of the impact of parental socioeconomic status, country of birth, and language spoken at home on SCIENTIFIC literacy**

|  | Aus-<br>tralia    | Can-<br>ada       | New<br>Zea-<br>land | USA                | Fin-<br>land       | France             | Ger-<br>many       | UK                 | Swe-<br>den        |
|--|-------------------|-------------------|---------------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
| Dependent variable: PISA scientific literacy score                                     |                   |                   |                     |                    |                    |                    |                    |                    |                    |
| Sample: all students   |                   |                   |                     |                    |                    |                    |                    |                    |                    |
| Constant   | 437.3**<br>(7.54) | 439.8**<br>(3.77) | 406.5**<br>(9.50)   | 380.4**<br>(9.63)  | 420.2**<br>(15.65) | 339.1**<br>(13.51) | 343.0**<br>(8.43)  | 398.2**<br>(10.90) | 388.0**<br>(9.29)  |
| Student<br>born in the<br>country  | 12.41<br>(6.97)   | 5.97<br>(3.75)    | 5.47<br>(7.85)      | -0.13<br>(9.99)    | 9.88<br>(13.85)    | 33.49**<br>(12.12) | 20.88*<br>(10.42)  | 16.09*<br>(7.32)   | 20.23**<br>(8.88)  |
| Mother<br>born in the<br>country   | -9.30<br>(4.95)   | -5.29<br>(2.81)   | -10.71<br>(6.45)    | 13.54<br>(10.30)   | -1.25<br>(17.21)   | 18.78**<br>(6.69)  | 3.88<br>(10.25)    | 4.98<br>(5.71)     | 2.62<br>(7.29)     |
| Father born<br>in the<br>country   | -7.60<br>(4.68)   | -6.89**<br>(2.66) | 9.06<br>(6.15)      | 5.50<br>(9.56)     | 12.87<br>(14.83)   | 25.01**<br>(6.27)  | 16.00<br>(8.44)    | 1.84<br>(5.83)     | 5.83<br>(7.22)     |
| National<br>lan-<br>guage<br>spoken at<br>home   | 37.39**<br>(6.15) | 39.72**<br>(3.91) | 61.16**<br>(9.25)   | 32.47**<br>(10.02) | 56.12*<br>(22.21)  | 18.59<br>(12.33)   | 56.87**<br>(10.39) | 30.12**<br>(10.08) | 41.85**<br>(11.55) |
| ISEI   | 1.37**<br>(0.10)  | 1.22**<br>(0.04)  | 1.61**<br>(0.11)    | 1.69**<br>(0.12)   | 1.00**<br>(0.09)   | 1.84**<br>(0.11)   | 1.65**<br>(0.10)   | 1.89**<br>(0.08)   | 1.36**<br>(0.11)   |
| R-squared  | 0.084             | 0.069             | 0.124               | 0.131              | 0.048              | 0.140              | 0.163              | 0.110              | 0.094              |
| Nobs.  | 2648              | 14778             | 1808                | 1768               | 2522               | 2301               | 2483               | 4728               | 2297               |
| Total effect of places of birth: herself, father and mother not born in the<br>country |                   |                   |                     |                    |                    |                    |                    |                    |                    |
|  | -4.49             | -6.21             | 3.83                | 18.91              | 21.50              | 77.29              | 40.77              | 22.92              | 28.69              |
| Foreign places of birth + foreign language spoken at home                              |                   |                   |                     |                    |                    |                    |                    |                    |                    |
|  | 32.90             | 33.51             | 64.99               | 51.38              | 77.63              | 95.89              | 97.64              | 53.05              | 70.55              |

Notes: Ordinary least squares (OLS) estimation based on PISA 2000 (OECD 2001). Nobs. = number of observations. (Asymptotic) Standard errors in parentheses. \*, \*\* denotes significance at the 5 percent, and 1 percent level, respectively.

**Table S4: Comparison of different migration/ non-migration scenarios: imputation of SCIENTIFIC literacy scores**

|                       | Aus-<br>tralia | Can-<br>ada | New<br>Zea-<br>land | USA    | Fin-<br>land | Franc<br>e | Ger-<br>many | UK     | Swe-<br>den |
|-----------------------|----------------|-------------|---------------------|--------|--------------|------------|--------------|--------|-------------|
| PISA_I<br>Nobs.       | 532.44         | 525.06      | 540.10              | 509.89 | 542.37       | 517.00     | 517.37       | 535.43 | 520.60      |
| PISA_I<br>Nobs.       | 1581           | 11884       | 1176                | 1526   | 2450         | 1849       | 2135         | 4160   | 1856        |
| PISA_II<br>Nobs. PI-  | 500.75         | 499.32      | 488.81              | 449.83 | 463.67       | 413.90     | 402.85       | 501.48 | 439.24      |
| SA_II<br>Nobs. PI-    | 163            | 530         | 122                 | 116    | 21           | 33         | 120          | 35     | 92          |
| PISA_III<br>Nobs. PI- | 544.09         | 542.33      | 555.65              | 494.88 | 518.02       | 435.63     | 466.99       | 521.38 | 485.88      |
| SA_III<br>Nobs. PI-   | 102            | 278         | 108                 | 28     | 6            | 14         | 56           | 65     | 16          |

Notes: Imputations are based on Table S3 and on sub-sample means of ISEI calculated from the OECDdata base on scientific literacy. Nobs. = number of observations. See the text for details.