

PISA 2015 TECHNICAL BACKGROUND

All tables in Annex A are available on line

Annex A1: Construction of indices and missing observations

Annex A2: The PISA target population, the pisa samples and the definition of schools

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Note regarding B-S-J-G (China)

B-S-J-G (China) refers to the four PISA participating Chinese provinces of Beijing, Shanghai, Jiangsu, Guangdong.

Note regarding CABA (Argentina)

CABA (Argentina) refers to the Ciudad Autónoma de Buenos Aires, Argentina.

Note regarding FYROM

FYROM refers to the Former Yugoslav Republic of Macedonia.

Notes regarding Cyprus

Note by Turkey: The information in this document with reference to "Cyprus" relates to the southern part of the Island. There is no single authority representing both Turkish and Greek Cypriot people on the Island. Turkey recognises the Turkish Republic of Northern Cyprus (TRNC). Until a lasting and equitable solution is found within the context of the United Nations, Turkey shall preserve its position concerning the "Cyprus issue".

Note by all the European Union Member States of the OECD and the European Union: The Republic of Cyprus is recognised by all members of the United Nations with the exception of Turkey. The information in this document relates to the area under the effective control of the Government of the Republic of Cyprus.

A note regarding Israel

The statistical data for Israel are supplied by and under the responsibility of the relevant Israeli authorities. The use of such data by the OECD is without prejudice to the status of the Golan Heights, East Jerusalem and Israeli settlements in the West Bank under the terms of international law.



ANNEX A1 CONSTRUCTION OF INDICES AND MISSING OBSERVATIONS

Explanation of the indices

This section explains the indices derived from the PISA 2015 student, school, and information and communications technology (ICT) questionnaires used in this volume.

Several PISA measures reflect indices that summarise responses from students, their parents, teachers or school representatives (typically principals) to a series of related questions. The questions were selected from a larger pool of questions on the basis of theoretical considerations and previous research. The *PISA 2015 Assessment and Analytical Framework* (OECD, 2017a) provides an in-depth description of this conceptual framework. Structural equation modelling was used to confirm the theoretically expected behaviour of most indices and to validate their comparability across countries. For this purpose, a model was estimated separately for each country and collectively for all OECD countries. For a detailed description of other PISA indices and details on the methods, see the *PISA 2015 Technical Report* (OECD, 2017b).

There are two types of indices used in this volume: simple indices and scale indices.

Simple indices are variables that are constructed through the arithmetic transformation or recoding of one or more items, in exactly the same way across assessments. Here, item responses are used to calculate meaningful variables, such as the recoding of the four-digit ISCO-08 codes into "Highest parents' socio-economic index (HISEI)" or, teacher-student ratio based on information from the school questionnaire.

Scale indices are variables constructed through the scaling of multiple items. Unless otherwise indicated, the index was scaled using a two-parameter item response model (a generalised partial credit model was used in the case of items with more than two categories) and values of the index correspond to Warm likelihood estimates (WLE) (Warm, 1985). For details on how each scale index was constructed, see the *PISA 2015 Technical Report* (OECD, 2017b). In general, the scaling was done in three stages:

- 1. The item parameters were estimated from equally-weighted samples of students from all countries and economies; only cases with a minimum number of three valid responses to items that are part of the index were included.
- 2. The estimates were computed for all students and all schools by anchoring the item parameters obtained in the preceding step.
- 3. The Warm likelihood estimates were then standardised so that the mean of the index value for the OECD student population was zero and the standard deviation was one, countries being given equal weight in the standardisation process.

Sequential codes were assigned to the different response categories of the questions in the sequence in which the latter appeared in the student, school or parent questionnaires. Where indicated in this section, these codes were inverted for the purpose of constructing indices or scales. Negative values for an index do not necessarily imply that students responded negatively to the underlying questions. A negative value merely indicates that the respondents answered less positively than all respondents did, on average across OECD countries. Likewise, a positive value on an index indicates that the respondents answered more favourably, or more positively, than respondents did, on average in OECD countries. Terms enclosed in brackets < > in the following descriptions were replaced in the national versions of the student, school and parent questionnaires by the appropriate national equivalent. For example, the term <qualification at ISCED level 5A> was translated in the United States into "Bachelor's degree, post-graduate certificate program, Master's degree program or first professional degree program". Similarly the term <classes in the language of assessment> in Luxembourg was translated into "German classes" or "French classes" depending on whether students received the German or French version of the assessment instruments.

In addition to the simple and scaled indices described in this annex, there are a number of variables from the questionnaires that were used in this volume and correspond to single items not used to construct indices. These non-recoded variables have prefix of "ST" for items in the student questionnaire, "SC" for items in the school questionnaire, "PA" for items from the parent questionnaire, "IC" for items from the ICT questionnaire, and "TC" for items from the teacher questionnaire. All the context questionnaires as well as the PISA international database, including all variables, are available through www.oecd.org/pisa.

Student-level simple indices

Student age

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The age of a student (AGE) was calculated as the difference between the year and month of testing and the year and month of a student's birth. Data on students' age were obtained from both the questionnaire (ST003) and student tracking forms. If the month of testing was not known for a particular student, the median month for that country was used in the calculation.



Immigration background

The PISA database contains three country-specific variables relating to the country of birth of the student, their mother and their father (COBN_S, COBN_M, and COBN_F). The items ST019Q01TA, ST019Q01TB and ST019Q01TC were recoded into the following categories: (1) country of birth is the same as country of assessment and (2) other. The index of immigrant background (IMMIG) was calculated from these variables with the following categories: (0) non-immigrant students (those students who had at least one parent born in the country), and (1) first- and second-generation immigrant students (those born outside the country of assessment and whose parent(s) were also born in another country, and those born in the country of assessment but whose parent(s) were born in another country). Students with missing responses for either the student or for both parents were assigned missing values for this variable.

Language spoken at home

Students indicated what language they usually speak at home (ST022), and the database includes a derived variable (LANGN) containing a country-specific code for each language. In addition, an internationally comparable variable was derived from this information with the following categories: (1) language at home is the same as the language of assessment for that student and (2) language at home is another language.

Attendance at pre-primary school

Students indicated the age at which they began pre-primary school (ISCED 0) in the student questionnaire (ST125). Students who did not remember whether they attended pre-primary school were not considered in analyses comparing students who attended and who did not attend pre-primary school. This definition differs slightly from the definition of the years of pre-primary school attendance used in *PISA 2015 Results (Volume II): Policies and Practices for Successful Schools* (OECD, 2016), which defined pre-primary school attendance through a derived variable that also relied on the age at which students began primary school (ISCED 1) (ST126).

Learning time

Learning time in total (TMINS) was computed using information about the average minutes in a <class period> (ST061) and information about the number of class periods per week attended in total (ST060). For convenience purposes, the information on learning time has been transformed into hours.

Index of student interaction in science class

The index of student interaction in science class was constructed from students' responses to question (ST098) on how often various communication-intensive activities take place in science class: "Students are given opportunities to explain their ideas"; "Students spend time in the laboratory doing practical experiments"; "Students are required to argue about science questions"; and "There is a class debate about investigations". Students can respond that these events take place "in all lessons", "in most lessons", "in some lessons", or "never or hardly ever". The index of student interaction in science class is calculated as the number of these activities that students say take place "in all lessons" or "in most lessons", and can vary from 0 to 4. Higher values indicate that students take part in communication- and interaction-intensive activities more often in science class.

Student-level scale indices

Sense of belonging

The index of sense of belonging (BELONG) was constructed from students' responses to a trend question about their sense of belonging at school. Students reported, on a four-point Likert scale with the response categories "strongly agree", "agree", "disagree", and "strongly disagree", their agreement with the following statements (ST034): "I feel like an outsider (or left out of things) at school"; "I make friends easily at school"; "I feel like I belong at school"; "I feel awkward and out of place in my school"; "Other students seem to like me"; and "I feel lonely at school". The answers to three items were reversed-coded so that higher values in the index indicate a greater sense of belonging.

Life satisfaction

Students' life satisfaction (ST016) level was based on their response to the question "Overall, how satisfied are you with your life as a whole these days". Their responses were limited to integers ranging from 0 (not at all satisfied) to 10 (completely satisfied). Students taking the computer-based questionnaire were asked to move the slider to the appropriate number (closer to 0 or to 10) and thus students could not respond below 0 or above 10.

Achievement motivation

The index of achievement motivation (MOTIVAT) was constructed from students' responses to a new question developed for PISA 2015 (ST119). Students reported, on a four-point Likert scale with the answering categories "strongly disagree", "disagree", "agree", and "strongly agree", their agreement with the following statements: "I want top grades in most or all of my courses"; "I want to be able to select from among the best opportunities available when I graduate"; "I want to be the best, whatever I do"; "I see myself as an ambitious person"; and "I want to be one of the best students in my class". Higher values indicate that students have greater achievement motivation.

Schoolwork-related anxiety

The index of schoolwork-related anxiety (ANXTEST) was constructed from student responses to question (ST118) over the extent to which they strongly agreed, agreed, disagreed or strongly disagreed with the following statements when asked to think about him or herself: "I often worry that it will be difficult for me taking a test"; "I worry that I will get poor <grades> at school";



"Even if I am well prepared for a test I feel very anxious"; "I get very tense when I study"; and "I get nervous when I don't know how to solve a task at school". Higher values indicate that students have more schoolwork-related anxiety.

Exposure to bullying

The index of bullying (BEINGBULLIED) was constructed from students' reports on how often ("never or almost never"; "a few times a year"; "a few times a month"; "once a week or more") the following happened (ST038): "Other students left me out of things on purpose"; "Other students made fun of me"; "I was threatened by other students"; "Other students took away or destroyed things that belonged to me"; "I got hit or pushed around by other students"; and "Other students spread nasty rumours about me". Higher values indicate that students are exposed to bullying more often.

Index of valuing relationships

The index of valuing relationships (COOPERATE) was constructed from students' responses to question (ST082) over the extent to which they strongly agreed, agreed, disagreed or strongly disagreed with the following statements: "I am a good listener"; "I enjoy seeing my classmates be successful"; "I take into account what others are interested in"; and "I enjoy considering different perspectives". Higher values indicate that students responded more affirmatively to these statements.

Index of valuing teamwork

The index of valuing teamwork (CPSVALUE) was constructed from students' responses to question (ST082) over the extent to which they strongly agreed, agreed, disagreed or strongly disagreed with the following statements: "I prefer working as part of a team to working alone"; "I find that teams make better decisions than individuals"; "I find that teamwork raises my own efficiency"; and "I enjoy co-operating with peers". Higher values indicate that students responded more affirmatively to these statements.

Index of ICT use at school

The index of ICT (information and communications technology) use at school (USESCH) was constructed using students' responses to question (IC011) regarding how often they use digital devices for the following activities: "<chatting online> at school"; "using email at school"; "browsing the Internet for schoolwork"; "downloading, uploading or browsing material from the school's website (e.g. <Intranet>)"; "posting [their] work on the school's website"; "playing simulations at school"; "practicing and drilling, such as for foreign language learning or mathematics"; "doing homework on a school computer"; and "using school computers for group work and communication with other students". Students could respond that they performed these activities "never or hardly ever", "once or twice a month", "once or twice a week", "almost every day" or "every day". Higher values indicate that students use ICT more often at school.

Index of students' perceived ICT competence

The index of students' perceived ICT competence (COMPICT) was constructed using students' responses to question (IC014) regarding their comfort with various digital devices. They were asked to state whether they "strongly agree", "agree", "disagree", or "strongly disagree" with the following statements: "I feel comfortable using digital devices that I am less familiar with"; "If my friends and relatives want to buy new digital devices or applications, I can give them advice"; "I feel comfortable using my digital devices at home"; "When I come across problems with digital devices, I think I can solve them"; "If my friends and relatives have a problem with digital devices, I can help them". Higher values indicate that students feel more comfortable and competent with digital devices and ICT.

Scaling of indices related to the PISA index of economic, social and cultural status

The PISA index of economic, social and cultural status (ESCS) was derived, as in previous cycles, from three variables related to family background: highest parental education (PARED), highest parental occupation (HISEI), and home possessions (HOMEPOS) including books in the home. PARED and HISEI are simple indices, described above. HOMEPOS is a proxy measure for family wealth.

Household possessions

In PISA 2015, students reported the availability of 16 household items at home (ST011) including three country-specific household items that were seen as appropriate measures of family wealth within the country's context. In addition, students reported the amount of possessions and books at home (ST012, ST013).

HOMEPOS is a summary index of all household items and possessions (ST011, ST012 and ST013). The home possessions scale for PISA 2015 was computed differently than in the previous cycles, to align the IRT model to the one used for all cognitive and non-cognitive scales. Categories for the number of books in the home are unchanged in PISA 2015. The items in ST011 (1 = "yes", 2 = "no") were reverse-coded so that a higher level indicates the presence of the indicator.

Computation of ESCS

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For the purpose of computing the PISA index of economic, social and cultural status (ESCS), values for students with missing PARED, HISEI or HOMEPOS were imputed with predicted values plus a random component based on a regression on the other two variables. If there were missing data on more than one of the three variables, ESCS was not computed and a missing value was assigned for ESCS.

The PISA index of economic, social and cultural status was derived from a principal component analysis of standardised variables (each variable has an OECD mean of zero and a standard deviation of one), taking the factor scores for the first



principal component as measures of the PISA index of economic, social and cultural status. All countries and economies (both OECD and partner countries/economies) contributed equally to the principal component analysis, while in previous cycles, the principal component analysis was based on OECD countries only. However, for the purpose of reporting, the ESCS scale has been transformed with zero being the score of an average OECD student and one being the standard deviation across equally weighted OECD countries.

Principal component analysis was also performed for each participating country or economy separately, to determine to what extent the components of the index operate in similar ways across countries and economies.

School-level simple indices

School type

Schools are classified as either public or private according to whether a private entity or a public agency has the ultimate power for decision making concerning its affairs (SC013). As in previous PISA surveys, the index on school type (SCHLTYPE) has three categories, based on two questions: SC013 which asks if the school is a public or a private school, and SC016 which asks about the sources of funding. This index was calculated in 2015 and in all previous cycles.

Class size and student-teacher ratio

The average class size (CLSIZE) is derived from one of nine possible categories in question SC003, ranging from "15 students or fewer" to "more than 50 students".

The student-teacher ratio (STRATIO) was obtained by dividing the number of enrolled students (SC002) by the total number of teachers (TOTAT).

Group-based extracurricular activities at school

School principals were asked to report what extracurricular activities their schools offered to 15-year old students (SC053). The index of group-based extracurricular activities at school was computed as the total number of the following activities that occurred at school: band, orchestra or choir; a school play or school musical; a school yearbook, newspaper or magazine; volunteering or service activities; and sports teams/activities. The index varied from 0 to 5, with each activity weighted equally.

Proportion of missing observations for variables used in this volume

Unless otherwise indicated, no adjustment is made for non-response to questionnaires in analyses included in this volume. The reported percentages and estimates based on indices refer to the proportion of the sample with valid responses to the corresponding questionnaire items. Table A1.1, available on line, reports the proportion of the sample covered by analyses based on the additional background questionnaire variables used in this volume. Similar tables are available in Annex A1 of PISA Volumes I and III for variables already used in analyses in earlier volumes. Where this proportion shows large variation across countries/economies or across time, caution is required when comparing results on these dimensions.

Tables available online

Table A1.1Weighted share of responding students covered by analyses of collaborative problem-solving performance
based on PISA questionnaires (http://dx.doi.org/10.1787/888933623761)

See also Table A1.3 from PISA Volume I for data on the weighted share of responding students covered by analyses based on the student, school and parent questionnaires: <u>http://dx.doi.org/10.1787/888933433112</u>.

In addition, see the following tables from PISA Volume III for data on the weighted share of responding students covered by additional analyses based on the student, educational career and parent questionnaires:

- Table A1.8a Weighted share of responding students covered by analyses based on the student and educational career questionnaires: <u>http://dx.doi.org/10.1787/888933473606</u>
- Table A1.8c Weighted share of responding students covered by analyses based on the parent questionnaire: <u>http://dx.doi.org/10.1787/888933473622</u>

References

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Warm, T.A. (1985), "Weighted Maximum Likelihood Estimation of Ability in Item Response Theory with Tests of Finite Length", Technical Report CGI-TR-85-08, U.S. Coast Guard Institute, Oklahoma City.



ANNEX A2 THE PISA TARGET POPULATION, THE PISA SAMPLES AND THE DEFINITION OF SCHOOLS

Definition of the PISA target population

PISA 2015 provides an assessment of the cumulative outcomes of education and learning at a point at which most young adults are still enrolled in initial education.

A major challenge for an international survey is to ensure that international comparability of national target populations is guaranteed.

Differences between countries in the nature and extent of pre-primary education and care, the age of entry into formal schooling and the institutional structure of education systems do not allow for a definition of internationally comparable grade levels. Consequently, international comparisons of performance in education typically define their populations with reference to a target age group. Some previous international assessments have defined their target population on the basis of the grade level that provides maximum coverage of a particular age cohort. A disadvantage of this approach is that slight variations in the age distribution of students across grade levels often lead to the selection of different target grades in different countries, or between education systems within countries, raising serious questions about the comparability of results across, and at times within, countries. In addition, because not all students of the desired age are usually represented in grade-based samples, there may be a more serious potential bias in the results if the unrepresented students are typically enrolled in the next higher grade in some countries and the next lower grade in others. This would exclude students with potentially higher levels of performance in the former countries and students with potentially lower levels of performance in the latter.

In order to address this problem, PISA uses an age-based definition for its target population, i.e. a definition that is not tied to the institutional structures of national education systems. PISA assesses students who were aged between 15 years and 3 (complete) months and 16 years and 2 (complete) months at the beginning of the assessment period, plus or minus a 1-month allowable variation, and who were enrolled in an educational institution with grade 7 or higher, regardless of the grade level or type of institutions are generally referred to as schools in this publication, although some educational institutions (in particular, some types of vocational education establishments) may not be termed schools in certain countries. As expected from this definition, the average age of students across OECD countries was 15 years and 9 months. The range in country means was 2 months and 18 days (0.20 years), from the minimum country mean of 15 years and 8 months to the maximum country mean of 15 years and 10 months.

Given this definition of population, PISA makes statements about the knowledge and skills of a group of individuals who were born within a comparable reference period, but who may have undergone different educational experiences both in and outside school. In PISA, these knowledge and skills are referred to as the outcomes of education at an age that is common across countries. Depending on countries' policies on school entry, selection and promotion, these students may be distributed over a narrower or a wider range of grades across different education systems, tracks or streams. It is important to consider these differences when comparing PISA results across countries, as observed differences between students at age 15 may no longer appear later on as/if students' educational experiences converge over time.

If a country's scores in science, reading or mathematics are significantly higher than those in another country, it cannot automatically be inferred that the schools or particular parts of the education system in the first country are more effective than those in the second. However, one can legitimately conclude that the cumulative impact of learning experiences in the first country, starting in early childhood and up to the age of 15, and encompassing experiences in school, home and beyond, have resulted in higher outcomes in the literacy in the domains that PISA measures.

The PISA target population does not include residents attending schools in a foreign country. It does, however, include foreign nationals attending schools in the country of assessment.

To accommodate countries that requested grade-based results for the purpose of national analyses, PISA 2015 provided a sampling option to supplement age-based sampling with grade-based sampling.

Population coverage

All countries and economies attempted to maximise the coverage of 15-year-olds enrolled in education in their national samples, including students enrolled in special-education institutions. As a result, PISA 2015 reached standards of population coverage that are unprecedented in international surveys of this kind.

The sampling standards used in PISA permitted countries to exclude up to a total of 5% of the relevant population either by excluding schools or by excluding students within schools. All but 12 countries – the United Kingdom (8.22%), Luxembourg (8.16%), Canada (7.49%), Norway (6.75%), New Zealand (6.54%), Sweden (5.71%), Estonia (5.52%), Australia (5.31%),



Montenegro (5.17%), Lithuania (5.12%), Latvia (5.07%), and Denmark (5.04%) – achieved this standard, and in 29 countries and economies, the overall exclusion rate was less than 2%. When language exclusions were accounted for (i.e. removed from the overall exclusion rate), Denmark, Latvia, New Zealand and Sweden no longer had an exclusion rate greater than 5%. For details, see www.oecd.org/pisa.

Exclusions within the above limits include:

- At the school level: schools that were geographically inaccessible or where the administration of the PISA assessment was not considered feasible; and schools that provided teaching only for students in the categories defined under "within-school exclusions", such as schools for the blind. The percentage of 15-year-olds enrolled in such schools had to be less than 2.5% of the nationally desired target population (0.5% maximum for the former group and 2% maximum for the latter group). The magnitude, nature and justification of school-level exclusions are documented in the *PISA 2015 Technical Report* (OECD, 2017).
- At the student level: students with an intellectual disability; students with a functional disability; students with limited assessment language proficiency; other (a category defined by the national centres and approved by the international centre); and students taught in a language of instruction for the main domain for which no materials were available. Students could not be excluded solely because of low proficiency or common disciplinary problems. The percentage of 15-year-olds excluded within schools had to be less than 2.5% of the nationally desired target population.

Table A2.1 describes the target population of the countries participating in PISA 2015. Further information on the target population and the implementation of PISA sampling standards can be found in the *PISA 2015 Technical Report* (OECD, 2017).

- Column 1 shows the total number of 15-year-olds according to the most recent available information, which in most countries
 means the year 2014 as the year before the assessment.
- Column 2 shows the number of 15-year-olds enrolled in schools in grade 7 or above (as defined above), which is referred to as the "eligible population".
- Column 3 shows the national desired target population. Countries were allowed to exclude up to 0.5% of students a priori from the eligible population, essentially for practical reasons. The following a priori exclusions exceed this limit but were agreed with the PISA Consortium: Belgium excluded 0.21% of its population for a particular type of student educated while working; Canada excluded 1.22% of its population from Territories and Aboriginal reserves; Chile excluded 0.04% of its students who live in Easter Island, Juan Fernandez Archipelago and Antarctica; and the United Arab Emirates excluded 0.04% of its students who had no information available. The adjudicated region of Massachusetts in the United States excluded 13.11% of its students, and North Carolina excluded 5.64% of its students. For these two regions, the desired target populations cover 15-year-old students in grade 7 or above in public schools only. The students excluded from the desired population are private school students.
- Column 4 shows the number of students enrolled in schools that were excluded from the national desired target population, either from the sampling frame or later in the field during data collection.
- Column 5 shows the size of the national desired target population after subtracting the students enrolled in excluded schools. This is obtained by subtracting Column 4 from Column 3.
- Column 6 shows the percentage of students enrolled in excluded schools. This is obtained by dividing Column 4 by Column 3 and multiplying by 100.
- Column 7 shows the number of students participating in PISA 2015. Note that in some cases this number does not account for 15-year-olds assessed as part of additional national options.
- Column 8 shows the weighted number of participating students, i.e. the number of students in the nationally defined target population that the PISA sample represents.
- Each country attempted to maximise the coverage of PISA's target population within the sampled schools. In the case of each sampled school, all eligible students, namely those 15 years of age, regardless of grade, were first listed. Sampled students who were to be excluded had still to be included in the sampling documentation, and a list drawn up stating the reason for their exclusion. Column 9 indicates the total number of excluded students, which is further described and classified into specific categories in Table A2.2.
- Column 10 indicates the weighted number of excluded students, i.e. the overall number of students in the nationally defined target population represented by the number of students excluded from the sample, which is also described and classified by exclusion categories in Table A2.2. Excluded students were excluded based on five categories: students with an intellectual disability (the student has a mental or emotional disability and is cognitively delayed such that he/she cannot perform in the PISA testing situation); students with a functional disability (the student has a moderate to severe permanent physical disability such that he/she cannot perform in the PISA testing situation); students with a functional disability (the student is unable to read or speak any of the languages of the assessment in the country and would be unable to overcome the language barrier in the testing situation typically a student who has received less than one year of instruction in the languages of assessment may be excluded); other (a category defined by the national centres and approved by the international centre); and students taught in a language of instruction for the main domain for which no materials were available.



[Part 1/1]

Table A2.1 PISA target populations and samples

		L			Рори	lation and sa	mple i	nformatio	n					Cov	erage ind	lices
		Total population of 15-year-olds	Total enrolled population of 15-year-olds at grade 7 or above	Total in national desired target population	Total school-level exclusions	Total in national desired target population after all school exclusions and before within-school exclusions	School-level exclusion rate (%)	Number of participating students	Weighted number of participating students	Number of excluded students	Weighted number of excluded students	Within-school exclusion rate (%)	Overall exclusion rate (%)	Coverage Index 1: Coverage of national desired population	Coverage Index 2: Coverage of national enrolled population	Coverage Index 3: Coverage of 15-vear-old
_		(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)	(13)	(14)	(1
	Australia Austria	282 888 88 013	282 547 82 683	282 547 82 683	6 940 790	275 607 81 893	2.46 0.96	14 530 7 007	256 329 73 379	681 84	7 736	2.93	5.31 2.11	0.947 0.979	0.947 0.979	0.9
	Belgium	123 630	121 954	121 694	1 597	120 097	1.31	9 651	114 902	39	410	0.36	1.66	0.979	0.979	0.9
	Canada	396 966	381 660	376 994	1 590	375 404	0.42	20 058	331 546	1 830	25 340	7.10	7.49	0.925	0.914	0.
	Chile	255 440	245 947	245 852	2 641	243 211	1.07	7 053	203 782	37	1 393	0.68	1.75	0.983	0.982	0.
	Czech Republic	90 391	90 076	90 076	1 814	88 262	2.01	6 894	84 519	25	368	0.43	2.44	0.976	0.976	0.
	Denmark	68 174	67 466	67 466	605	66 861	0.90	7 161	60 655	514	2 644	4.18	5.04	0.950	0.950	0.
	Estonia Finland	11 676 58 526	11 491 58 955	11 491 58 955	416 472	11 075 58 483	3.62 0.80	5 587 5 882	10 834 56 934	116 124	218 1 157	1.97 1.99	5.52 2.78	0.945 0.972	0.945 0.972	0.
	France	807 867	778 679	778 679	28 7 42	749 937	3.69	6 108	734 944	35	3 620	0.49	4.16	0.972	0.972	0.
	Germany	774 149	774 149	774 149	11 150	762 999	1.44	6 522	743 969	54	5 342	0.71	2.14	0.979	0.979	0.
	Greece	105 530	105 253	105 253	953	104 300	0.91	5 532	96 157	58	965	0.99	1.89	0.981	0.981	0.
	Hungary	94 515	90 065	90 065	1 945	88 120	2.16	5 658	84 644	55	1 009	1.18	3.31	0.967	0.967	0.
	Iceland	4 250	4 195	4 195	17	4 178	0.41	3 374	3 966	131	132	3.23	3.62	0.964	0.964	0.
	Ireland	61 234	59 811	59 811	72	59 739	0.12	5 741	59 082	197	1 825	3.00	3.11	0.969	0.969	0.
	Israel Italy	124 852 616 761	118 997 567 268	118 997 567 268	2 310 11 190	116 687 556 078	1.94 1.97	6 598 11 583	117 031 495 093	115 246	1 803 9 395	1.52	3.43 3.80	0.966 0.962	0.966	0.
	Japan	1 201 615	1 175 907	1 175 907	27 323	1 148 584	2.32	6 647	1 138 349	246	318	0.03	2.35	0.962	0.962	0.
	Korea	620 687	619 950	619 950	3 555	616 395	0.57	5 581	569 106	20	1 806	0.32	0.89	0.991	0.970	0.
	Latvia	17 255	16 955	16 955	677	16 278	3.99	4 869	15 320	70	174	1.12	5.07	0.949	0.949	0.
	Luxembourg	6 327	6 053	6 053	162	5 891	2.68	5 299	5 540	331	331	5.64	8.16	0.918	0.918	0.
	Mexico	2 257 399	1 401 247	1 401 247	5 905	1 395 342	0.42	7 568	1 392 995	30	6 810	0.49	0.91	0.991	0.991	0.
	Netherlands	201 670	200 976 57 448	200 976	6 866	194 110	3.42	5 385	191 817	14 333	502	0.26	3.67 6.54	0.963 0.935	0.963 0.935	0.
	New Zealand Norway	60 162 63 642	63 491	57 448 63 491	681 854	56 767 62 637	1.19	4 520 5 456	54 274 58 083	345	3 112 3 366	5.42	6.75	0.933	0.933	0.
	Poland	380 366	361 600	361 600	6 1 2 2	355 478	1.69	4 478	345 709	34	2 418	0.69	2.38	0.933	0.933	0.
	Portugal	110 939	101 107	101 107	424	100 683	0.42	7 325	97 214	105	860	0.88	1.29	0.987	0.987	0.
	Slovak Republic	55 674	55 203	55 203	1 376	53 827	2.49	6 3 5 0	49 654	114	912	1.80	4.25	0.957	0.957	0.
	Slovenia	18 078	17 689	17 689	290	17 399	1.64	6 406	16 773	114	247	1.45	3.07	0.969	0.969	0.
	Spain	440 084	414 276	414 276	2 175	412 101	0.53	6 736	399 935	200	10 893	2.65	3.16	0.968	0.968	0.
	Sweden Switzerland	97 749 85 495	97 210 83 655	97 210 83 655	1 214 2 320	95 996 81 335	1.25	5 458 5 860	91 491 82 223	275 107	4 324 1 357	4.51	5.71 4.35	0.943 0.956	0.943 0.956	0.
	Turkey	1 324 089	1 100 074	1 100 074	5 746	1 094 328	0.52	5 895	925 366	31	5 359	0.58	1.10	0.956	0.938	0.
	United Kingdom	747 593	746 328	746 328	23 412	722 916	3.14	14 157	627 703	870	34 747	5.25	8.22	0.918	0.918	0.
	United States	4 220 325	3 992 053	3 992 053	12 001	3 980 052	0.30	5 712	3 524 497	193	109 580	3.02	3.31	0.967	0.967	0.
	Albania	48 610	45 163	45 163	10	45 153	0.02	5 2 1 5	40 896	0	0	0.00	0.02	1.000	1.000	0.
	Algeria	389 315	354 936	354 936	0	354 936	0.00	5 519	306 647	0	0	0.00	0.00	1.000	1.000	0.
	Argentina	718 635	578 308	578 308	2 617	575 691	0.45	6 349	394 917	21	1 367	0.34	0.80	0.992	0.992	0.
	Brazil	3 803 681	2 853 388	2 853 388	64 392	2 788 996	2.26	23 141	2 425 961	119	13 543	0.56	2.80	0.972	0.972	0.
	B-S-J-G (China) Bulgaria	2 084 958 66 601	1 507 518 59 397	1 507 518 59 397	58 639 1 124	1 448 879 58 273	3.89	9 841 5 928	1 331 794 53 685	33 49	3 609 433	0.27	4.15	0.959 0.973	0.959 0.973	0.
	Colombia	760 919	674 079	674 079	37	674 042	0.01	11 795	567 848	9	507	0.00	0.09	0.999	0.999	0.
	Costa Rica	81 773	66 524	66 524	0	66 524	0.00	6 866	51 897	13	98	0.19	0.19	0.998	0.998	0.
	Croatia	45 031	35 920	35 920	805	35 115	2.24	5 809	40 899	86	589	1.42	3.63	0.964	0.964	0.
	Cyprus*	9 255	9 255	9 253	109	9 1 4 4	1.18	5 571	8 785	228	292	3.22	4.36	0.956	0.956	0.
	Dominican Republic	193 153	139 555	139 555	2 382	137 173	1.71	4 740	132 300	4	106	0.08	1.79	0.982	0.982	0.
	FYROM Georgia	16 719 48 695	16 717 43 197	16 717 43 197	259 1675	16 458 41 522	1.55 3.88	5 324 5 316	15 847 38 334	8 35	230	0.12	1.67 4.45	0.983 0.955	0.983 0.955	0.
	Hong Kong (China)	65 100	61 630	61 630	708	60 922	1.15	5 3 1 6	57 662	35	374	0.60	4.45	0.955	0.955	0.
	Indonesia	4 534 216	3 182 816	3 182 816	4 046	3 178 770	0.13	6 513	3 092 773	0	0	0.00	0.13	0.999	0.999	0.
	Jordan	126 399	121 729	121 729	71	121 658	0.06	7 267	108 669	70	1 006	0.92	0.97	0.990	0.990	0.
	Kazakhstan	211 407	209 555	209 555	7 475	202 080	3.57	7 841	192 909	0	0	0.00	3.57	0.964	0.964	0.
	Kosovo	31 546	28 229	28 229	1 1 5 6	27 073	4.10	4 826	22 333	50	174	0.77	4.84	0.952	0.952	0.
	Lebanon Lithuania	64 044 33 163	62 281 32 097	62 281 32 097	1 300 573	60 981 31 524	2.09 1.79	4 546 6 525	42 331 29 915	0 227	0 1 050	0.00	2.09 5.12	0.979 0.949	0.979 0.949	0.
	Macao (China)	5 100	4 417	4 417	3/3	4 414	0.07	4 476	4 507	0	0	0.00	0.07	0.949	0.949	0.
	Malaysia	540 000	448 838	448 838	2 418	446 420	0.54	8 861	412 524	41	2 344	0.56	1.10	0.989	0.989	0.
	Malta	4 3 9 7	4 406	4 406	63	4 343	1.43	3 634	4 2 9 6	41	41	0.95	2.36	0.976	0.976	0.
	Moldova	31 576	30 601	30 601	182	30 419	0.59	5 325	29 341	21	118	0.40	0.99	0.990	0.990	0.
	Montenegro	7 524	7 506	7 506	40	7 466	0.53	5 665	6 777	300	332	4.66	5.17	0.948	0.948	0.
	Peru Qatar	580 371 13 871	478 229 13 850	478 229 13 850	6 355 380	471 874 13 470	1.33	6 971 12 083	431 738 12 951	13 193	745 193	0.17	1.50	0.985 0.958	0.985 0.958	0.
	Romania	176 334	176 334	176 334	1 823	174 511	1.03	4 876	164 216	193	193	0.07	4.17	0.958	0.958	0.
	Russia	1 176 473	1 172 943	1 172 943	24 217	1 148 726	2.06	6 036	1 120 932	13	2 469	0.07	2.28	0.989	0.989	0.
	Singapore	48 218	47 050	47 050	445	46 605	0.95	6 115	46 224	25	179	0.39	1.33	0.987	0.987	0.
	Chinese Taipei	295 056	287 783	287 783	1 1 7 9	286 604	0.41	7 708	251 424	22	647	0.26	0.67	0.993	0.993	0.
	Thailand	895 513	756 917	756 917	9 646	747 271	1.27	8 2 4 9	634 795	22	2 107	0.33	1.60	0.984	0.984	0.
	Trinidad and Tobago Tunisia	17 371 122 186	17 371 122 186	17 371 122 186	0 679	17 371 121 507	0.00	4 692 5 375	13 197 113 599	0	61	0.00	0.00	1.000 0.994	1.000 0.994	0.
	United Arab Emirates	51 687	51 518	51 499	994	50 505	1.93	5 3/5	46 950	63	152	0.05	2.25	0.994	0.994	0.
	Uruguay	53 533	43 865	43 865	4	43 861	0.01	6 062	38 287	6	32	0.02	0.09	0.999	0.999	0.
	Viet Nam	1 803 552		1 032 599	6 557	1 026 042		5 826	874 859	0	0		0.63	0.994	0.994	0.

Notes: For a full explanation of the details in this table please refer to the *PISA 2015 Technical Report* (OECD, 2017). The figure for total national population of 15-year-olds enrolled in Column 2 may occasionally be larger than the total number of 15-year-olds in Column 1 due to differing data sources. For Mexico, in 2015, the Total population of 15-year-olds enrolled in grade 7 or above is an estimate of the target population size of the sample frame from which the 15-year-olds students were selected for the PISA test. At the time Mexico provided the information to PISA, the official figure for this population was 1 573 952. * See note at the beginning of this Annex. **StatLink and** http://dx.doi.org/10.1787/888933433129



[Part 1/2] Table A2.2 Exclusions

				Student exclusio	ns (unweighted)		
		Number of excluded students with functional disability (Code 1) (1)	Number of excluded students with intellectual disability (Code 2) (2)	Number of excluded students because of language (Code 3) (3)	Number of excluded students for other reasons (Code 4) (4)	Number of excluded students because of no materials available in the language of instruction (Code 5) (5)	School-level exclusion rate (%) (6)
9	Australia	85	528	68	0	0	681
OECD	Austria	8	15	61	0	0	84
0	Belgium	4	18	17	0	0	39
	Canada Chile	156	1 308 30	366	0	0	1 830 37
	Czech Republic	2	9	14	0	0	25
	Denmark	18	269	156	70	1	514
	Estonia	17	93	6	0	0	116
	Finland	2	90	17	8	7	124
	France	5	21	9	0	0	35
	Germany Greece	4	25 44	25 11	0	0	54 58
	Hungary	3	13	9	30	0	55
	Iceland	9	66	47	9	0	131
	Ireland	25	57	55	60	0	197
	Israel	22	68	25	0	0	115
	Italy	78	147	21	0	0	246
	Japan Korea	3	17	0	0	0	20
	Latvia	7	47	16	0	0	70
	Luxembourg	4	254	73	0	0	331
	Mexico	4	23	3	0	0	30
	Netherlands New Zealand	1 23	13 140	0 167	0	0 3	14 333
	Norway	11	253	81	0	0	345
	Poland	11	20	0	3	0	34
	Portugal	4	99	2	0	0	105
	Slovak Republic	7	71	2	34	0	114
	Slovenia Spain	33	36 144	45 47	0	0	114 200
	Sweden	154	0	121	0	0	275
	Switzerland	8	42	57	0	0	107
	Turkey	1	23	7	0	0	31
	United Kingdom	77	690	102	0	1	870
	United States	16	120	44	13	0	193
ş	Albania	0	0	0	0	0	0
Partners	Algeria	0	0	0	0	0	0
ari	Argentina	10	10	1	0	0	21
	Brazil B-S-J-G (China)	20	99 25	0	0	0	119 33
	Bulgaria	39	6	4	0	0	49
	Colombia	3	4	2	0	0	9
	Costa Rica	3	1	0	9	0	13
	Croatia Cyprus*	2	75	9	0	0	86
	Dominican Republic	12	164 3	52	0	0	228 4
	FYROM	7	1	0	0	0	8
	Georgia	3	25	7	0	0	35
	Hong Kong (China)	0	35	1	0	0	36
	Indonesia Jordan	0 43	0 17	0 10	0	0	0 70
	Kazakhstan	0	0	0	0	0	0
	Kosovo	9	13	27	0	0	50
	Lebanon	0	0	0	0	0	0
	Lithuania Macao (China)	12	213 0	2	0	0	227 0
	Macao (China) Malaysia	10	22	9	0	0	41
	Malta	8	27	6	0	0	41
	Moldova	12	8	1	0	0	21
	Montenegro	14	23	5	0	258	300
	Peru	4 76	9 110	0 7	0	0	13
	Qatar Romania	1	1	1	0	0	193 3
	Russia	3	10	0	0	0	13
	Singapore	3	15	7	0	0	25
	Chinese Taipei	3	19	0	0	0	22
	Thailand	1	19	2	0	0	22
	Trinidad and Tobago Tunisia	0	0	0 3	0	0	0
	United Arab Emirates	16	24	23	0	0	63
	Uruguay	2	4	0	0	0	6
	Viet Nam	0	0	0	0	0	0

 Exclusion codes:

 Code 1: Functional disability – student has a moderate to severe permanent physical disability.

 Code 2: Intellectual disability – student has a moderate to severe permanent physical disability.

 Code 3: Limited assessment language proficiency – student is not a native speaker of any of the languages of the assessment in the country and has been resident in the country for less than one year.

 Code 4: Other reasons defined by the national centres and approved by the international centre.

 Code 4: Other reasons defined by the national centres and approved by the international centre.

 Code 5: No materials available in the language of instruction.

 Note: For a full explanation of the details in this table please refer to the *PISA 2015 Technical Report* (OECD, 2017).

 * See note at the beginning of this Annex.

 StatLink area
 http://dx.doi.org/10.1787/888933433129

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[Part 2/2] Table A2.2 Exclusions

				Student exclus	ion (weighted)		
		Weighted number of excluded students with functional disability (Code 1)	Weighted number of excluded students with intellectual disability (Code 2)	Weighted number of excluded students because of language (Code 3)	Weighted number of excluded students for other reasons (Code 4)	Weighted number of excluded students because of no materials available in the language of instruction (Code 5)	Total weighted number of excluded students
		(7)	(8)	(9)	(10)	(11)	(12)
9	Australia	932	6 011	793	0	0	7 736
	Austria	74	117	675	0	0	866
	Belgium	33	192	185	0	0	410
	Canada Chile	1 901 194	18 018 1 190	5 421 9	0	0	25 340 1 393
	Czech Republic	40	140	188	0	0	368
	Denmark	122	1 539	551	421	11	2 644
	Estonia	29	176	13	0	0	218
	Finland	18	858	156	67	58	1 157
	France	562	2 144	914	0	0	3 620
	Germany	423	2 562	2 357	0	0	5 342
	Greece Hungary	43 57	729 284	193 114	0 554	0	965 1 009
	Iceland	9	67	47	9	0	132
	Ireland	213	526	516	570	0	1 825
	Israel	349	1 070	384	0	0	1 803
	Italy	3 316	5 199	880	0	0	9 3 9 5
	Japan	0	318	0	0	0	318
	Korea Latvia	291 21	1 515 115	0 38	0	0	1 806 174
	Luxembourg	4	254	73	0	0	331
	Mexico	842	4 802	1 165	0	0	6 810
	Netherlands	33	469	0	0	0	502
	New Zealand	233	1 287	1 568	0	24	3 112
	Norway	105	2 471	790	0	0	3 366
	Poland	876 29	1 339	0	203	0	2 418
	Portugal Slovak Republic	44	818 567	13 12	0 288	0	860 912
	Slovenia	84	71	92	0	0	247
	Spain	511	7 662	2 720	0	0	10 893
	Sweden	2 380	0	1 944	0	0	4 324
	Switzerland	91	540	726	0	0	1 357
	Turkey	43 2 724	4 094 27 808	1 222 4 001	0	0 214	5 359 34 747
	United Kingdom United States	7 873	67 816	26 525	7 366	0	109 580
SLS	Albania	0	0	0	0	0	0
	Algeria	0 579	0	0 18	0	0	0 1 367
Par	Argentina Brazil	1 743	770 11 800	0	0	0	13 543
	B-S-J-G (China)	438	2 970	201	0	0	3 609
	Bulgaria	347	51	35	0	0	433
	Colombia	181	309	17	0	0	507
	Costa Rica	22	5	0	71	0	98
	Croatia Cyprus*	13 16	501 212	75 65	0	0	589 292
	Dominican Republic	24	82	0	0	0	106
	FYROM	15	4	0	0	0	19
	Georgia	19	170	41	0	0	230
	Hong Kong (China)	0	363	11	0	0	374
	Indonesia Jordan	0 656	0 227	0 122	0	0	0 1 006
	Kazakhstan	0	0	0	0	0	0
	Kosovo	28	37	104	0	0	174
	Lebanon	0	0	0	0	0	0
	Lithuania Macao (China)	40	1 000	10	0	0	1 050
	Malaysia	663	1 100	580	0	0	2 344
	Malta	8	27	6	0	0	41
	Moldova	66	51	1	0	0	118
	Montenegro	27	38	6	0	261	332
	Peru	224	520	0	0	0	745
	Qatar Romania	76 31	110 63	7 26	0	0	193 120
	Russia	425	2 044	0	0	0	2 469
	Singapore	22	115	43	0	0	179
	Chinese Taipei	78	568	0	0	0	647
	Thailand	114	1 830	163	0	0	2 107
	Trinidad and Tobago Tunisia	0	0	0 61	0	0	0 61
	United Arab Emirates	30	75	47	0	0	152
	Uruguay	10	22	0	0	0	32
	Viet Nam	0	0	0	0	0	0

Exclusion codes:
 Code 1: Functional disability – student has a moderate to severe permanent physical disability.
 Code 2: Intellectual disability – student has a mental or emotional disability and has either been tested as cognitively delayed or is considered in the professional opinion of qualified staff to be cognitively delayed.
 Code 3: Limited assessment language proficiency – student is not a native speaker of any of the languages of the assessment in the country and has been resident in the country for less than one year.
 Code 4: Other reasons defined by the national centres and approved by the international centre.
 Code 5: No materials available in the language of instruction.
 Note: For a full explanation of the details in this table please refer to the *PISA 2015 Technical Report* (OECD, 2017).
 * See note at the beginning of this Annex.

* See note at the beginning of this Annex. **StatLink age** http://dx.doi.org/10.1787/888933433129



- Column 11 shows the percentage of students excluded within schools. This is calculated as the weighted number of excluded students (Column 10), divided by the weighted number of excluded and participating students (Column 8 plus Column 10), then multiplied by 100.
- Column 12 shows the overall exclusion rate, which represents the weighted percentage of the national desired target population excluded from PISA either through school-level exclusions or through the exclusion of students within schools. It is calculated as the school-level exclusion rate (Column 6 divided by 100) plus within-school exclusion rate (Column 11 divided by 100) multiplied by 1 minus the school-level exclusion rate (Column 6 divided by 100). This result is then multiplied by 100.
- Column 13 presents an index of the extent to which the national desired target population is covered by the PISA sample. Australia, Canada, Denmark, Estonia, Latvia, Lithuania, Luxembourg, Montenegro, New Zealand, Norway, Sweden and the United Kingdom were the only countries where the coverage is below 95%.
- Column 14 presents an index of the extent to which 15-year-olds enrolled in schools are covered by the PISA sample. The index measures the overall proportion of the national enrolled population that is covered by the non-excluded portion of the student sample. The index takes into account both school-level and student-level exclusions. Values close to 100 indicate that the PISA sample represents the entire education system as defined for PISA 2015. The index is the weighted number of participating students (Column 8) divided by the weighted number of participating and excluded students (Column 8 plus Column 10), times the nationally defined target population (Column 5) divided by the eligible population (Column 2) (times 100).
- Column 15 presents an index of the coverage of the 15-year-old population. This index is the weighted number of participating students (Column 8) divided by the total population of 15-year-old students (Column 1).

This high level of coverage contributes to the comparability of the assessment results. For example, even assuming that the excluded students would have systematically scored worse than those who participated, and that this relationship is moderately strong, an exclusion rate on the order of 5% would likely lead to an overestimation of national mean scores of less than 5 score points (on a scale with an international mean of 500 score points and a standard deviation of 100 score points). This assessment is based on the following calculations: if the correlation between the propensity of exclusions and student performance is 0.3, resulting mean scores would likely be overestimated by 1 score point if the exclusion rate is 1%, by 3 score points if the exclusion rate is 5%, and by 6 score points if the exclusion rate is 10%. If the correlation between the propensity of exclusions and student performance is 0.5, resulting mean scores would be overestimated by 1 score point if the exclusion rate is 1%, by 5 score points if the exclusion rate is 5%, and by 6 score points if the exclusion rate is 10%. If the correlation between the propensity of exclusions and student performance is 0.5, resulting mean scores would be overestimated by 1 score point if the exclusion rate is 1%, by 5 score points if the exclusion rate is 5%, and by 10 score points if the exclusion rate is 10%. For this calculation, a model was used that assumes a bivariate normal distribution for performance and the propensity to participate. For details, see the *PISA 2015 Technical Report* (OECD, 2017).

Sampling procedures and response rates

The accuracy of any survey results depends on the quality of the information on which national samples are based as well as on the sampling procedures. Quality standards, procedures, instruments and verification mechanisms were developed for PISA that ensured that national samples yielded comparable data and that the results could be compared with confidence.

Most PISA samples were designed as two-stage stratified samples (where countries applied different sampling designs, these are documented in the *PISA 2015 Technical Report* [OECD, 2017]). The first stage consisted of sampling individual schools in which 15-year-old students could be enrolled. Schools were sampled systematically with probabilities proportional to size, the measure of size being a function of the estimated number of eligible (15-year-old) students enrolled. At least 150 schools were selected in each country (where this number existed), although the requirements for national analyses often required a somewhat larger sample. As the schools were sampled, replacement schools were simultaneously identified, in case a sampled school chose not to participate in PISA 2015.

In the case of Iceland, Luxembourg, Macao (China), Malta and Qatar, all schools and all eligible students within schools were included in the sample.

Experts from the PISA Consortium performed the sample selection process for most participating countries and monitored it closely in those countries that selected their own samples. The second stage of the selection process sampled students within sampled schools. Once schools were selected, a list of each sampled school's 15-year-old students was prepared. From this list, 42 students were then selected with equal probability (all 15-year-old students were selected if fewer than 42 were enrolled). The number of students to be sampled per school could deviate from 42, but could not be less than 20.

Data-quality standards in PISA required minimum participation rates for schools as well as for students. These standards were established to minimise the potential for response biases. In the case of countries meeting these standards, it was likely that any bias resulting from non-response would be negligible, i.e. typically smaller than the sampling error.

A minimum response rate of 85% was required for the schools initially selected. Where the initial response rate of schools was between 65% and 85%, however, an acceptable school-response rate could still be achieved through the use of replacement schools.

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This procedure brought with it a risk of increased response bias. Participating countries were, therefore, encouraged to persuade as many of the schools in the original sample as possible to participate. Schools with a student participation rate between 25% and 50% were not regarded as participating schools, but data from these schools were included in the database and contributed to the various estimations. Data from schools with a student participation rate of less than 25% were excluded from the database.

PISA 2015 also required a minimum participation rate of 80% of students within participating schools. This minimum participation rate had to be met at the national level, not necessarily by each participating school. Follow-up sessions were required in schools in which too few students had participated in the original assessment sessions. Student participation rates were calculated over all original schools, and also over all schools, whether original sample or replacement schools, and from the participation of students in both the original assessment and any follow-up sessions. A student who participated in the original or follow-up cognitive sessions was regarded as a participant. Those who attended only the questionnaire session were included in the international database and contributed to the statistics presented in this publication if they provided at least a description of their father's or mother's occupation.

Table A2.3 shows the response rates for students and schools, before and after replacement.

- Column 1 shows the weighted participation rate of schools before replacement. This is obtained by dividing Column 2 by Column 3.
- Column 2 shows the weighted number of responding schools before school replacement (weighted by student enrolment).
- Column 3 shows the weighted number of sampled schools before school replacement (including both responding and non-responding schools, weighted by student enrolment).
- Column 4 shows the unweighted number of responding schools before school replacement.
- Column 5 shows the unweighted number of responding and non-responding schools before school replacement.
- Column 6 shows the weighted participation rate of schools after replacement. This is obtained by dividing Column 7 by Column 8.
- Column 7 shows the weighted number of responding schools after school replacement (weighted by student enrolment).
- Column 8 shows the weighted number of schools sampled after school replacement (including both responding and non-responding schools, weighted by student enrolment).
- Column 9 shows the unweighted number of responding schools after school replacement.
- Column 10 shows the unweighted number of responding and non-responding schools after school replacement.
- Column 11 shows the weighted student participation rate after replacement. This is obtained by dividing Column 12 by Column 13.
- Column 12 shows the weighted number of students assessed.
- Column 13 shows the weighted number of students sampled (including both students who were assessed and students who
 were absent on the day of the assessment).
- Column 14 shows the unweighted number of students assessed. Note that any students in schools with student-response rates of less than 50% were not included in these rates (both weighted and unweighted).
- Column 15 shows the unweighted number of students sampled (including both students that were assessed and students who
 were absent on the day of the assessment). Note that any students in schools where fewer than half of the eligible students
 were assessed were not included in these rates (neither weighted nor unweighted).

Definition of schools

In some countries, subunits within schools were sampled instead of schools, and this may affect the estimation of the betweenschool variance components. In Austria, the Czech Republic, Germany, Hungary, Japan, Romania and Slovenia, schools with more than one study programme were split into the units delivering these programmes. In the Netherlands, for schools with both lower and upper secondary programmes, schools were split into units delivering each programme level. In the Flemish community of Belgium, in the case of multi-campus schools, implantations (campuses) were sampled, whereas in the French community, in the case of multi-campus schools, the larger administrative units were sampled. In Australia, for schools with more than one campus, the individual campuses were listed for sampling. In Argentina and Croatia, schools that had more than one campus had the locations listed for sampling. In Spain, the schools in the Basque region with multi-linguistic models were split into linguistic models for sampling. In Luxembourg, a school on the border with Germany was split according to the country in which the students resided. In addition, the International schools in Luxembourg were split into the students who were instructed in any of the three official languages, and those in the part of the schools that was excluded because no materials were available in the languages of instruction. The United Arab Emirates had schools split by curricula, and sometimes by gender, with other schools remaining whole. Because of reorganisation, some of Sweden's schools were split into parts, with each part having one principal. In Portugal, schools were reorganised into clusters, with teachers and the principal shared by all units in the school cluster.



[Part 1/1]

Table A2.3 Response rates

				nitial sample school repla		t			al sample – lool replace	ment		Final sample – students within schools after school replacement						
					_													
		Weighted school participation rate before replacement (%)	Weighted number of responding schools (weighted also by enrolment)	Weighted number of schools sampled (responding and non-responding) (weighted also by enrolment)	Number of responding and non- responding schools (unweighted)	Total in mational desired target population after all school exclusions and before within- school exclusions	Weighted school participation rate after replacement (%)	Weighted number of responding schools (weighted also by enrolment)	Weighted number of schools sampled (responding and non-responding) (weighted also by enrolment)	Number of responding schools (unweighted)	Number of responding and non- responding schools (unweighted)	Weighted student participation rate after replacement (%)	Number of students assessed (weighted)	Number of students sampled (assessed and absent) (weighted)	Number of students assessed (unweighted)	Number of students sampled (assessed and absent) (unweighted)		
~	Australia	(1) 94	(2) 260 657	(3) 276 072	(4) 720	(5) 788	(6) 95	(7) 262 130	(8) 276 072	(9) 723	(10) 788	(11) 84	(12) 204 763	(13) 243 789	(14) 14 089	(15) 17 477		
ECL	Austria	100	81 690	81 730	269	273	100	81 690	81 730	269	273	87	63 660	73 521	7 007	9 868		
Partners	Belgium Canada	83 74	98 786 283 853	118 915 381 133	244 703	301 1 008	95 79	113 435 299 512	118 936 381 189	286 726	301 1 008	91 81	99 760 210 476	110 075 260 487	9 635 19 604	10 602 24 129		
	Chile	92	215 139	232 756	207	232	99	230 749	232 757	226	232	93	189 206	202 774	7 039	7 515		
	Czech Republic Denmark	98 90	86 354 57 803	87 999 63 897	339 327	344 371	98 92	86 354 58 837	87 999 63 931	339 331	344 371	89 89	73 386 49 732	82 672 55 830	6 835 7 149	7 693 8 184		
	Estonia	100	11 142	11 154	206	207	100	11 142	11 154	206	207	93	10 088	10 822	5 587	5 994		
	Finland France	100 91	58 653 679 984	58 782 749 284	167 232	168 255	100 94	58 800 706 838	58 800 749 284	168 241	168 255	93 88	53 198 611 563	56 934 693 336	5 882 5 980	6 294 6 783		
	Germany	96	764 423	794 204	245	255	99	785 813	794 204	253	255	93	685 972	735 487	6 476	6 944		
	Greece	92	95 030	103 031	190	212	98	101 653	103 218	209	212	94	89 588	94 986	5 511	5 838		
	Hungary Iceland	93 99	83 897 4 114	89 808 4 163	231 122	251 129	99 99	88 751 4 114	89 825 4 163	244 122	251 129	92 86	77 212 3 365	83 657 3 908	5 643 3 365	6 101 3 908		
	Ireland	99	61 023	61 461	167	169	99	61 023	61 461	167	169	89	51 947	58 630	5 741	6 478		
	Israel Italy	91 74	105 192 383 933	115 717 516 113	169 414	190 532	93 88	107 570 451 098	115 717 515 515	173 464	190 532	90 88	98 572 377 011	108 940 430 041	6 598 11 477	7 294 12 841		
	Japan	94	1 087 414	1 151 305	189	200	99	1 139 734	1 151 305	198	200	97	1 096 193	1 127 265	6 647	6 838		
	Korea Latvia	100 86	612 937 14 122	615 107 16 334	168 231	169 269	100 93	612 937 15 103	615 107 16 324	168 248	169 269	99 90	559 121 12 799	567 284 14 155	5 581 4 845	5 664 5 368		
1	Luxembourg	100	5 891	5 891	44	44	100	5 891	5 891	44	44	96	5 299	5 540	5 2 9 9	5 540		
	Mexico Netherlands	95	1 311 608	1 373 919	269	284	98	1 339 901 178 929	1 373 919	275 184	284	95	1 290 435 152 346	1 352 237 178 985	7 568 5 345	7 938		
	New Zealand	63 71	121 527 40 623	191 966 56 875	125 145	201 210	93 85	48 094	191 966 56 913	176	201 210	85 80	36 860	45 897	4 453	6 269 5 547		
	Norway	95	58 824	61 809	229	241	95	58 824	61 809	229	241	91	50 163	55 277	5 456	6 016		
1.1	Poland Portugal	88 86	314 288 87 756	355 158 102 193	151 213	170 254	99 95	352 754 97 516	355 158 102 537	168 238	170 254	88 82	300 617 75 391	343 405 91 916	4 466 7 180	5 108 8 732		
- 1	Slovak Republic	93	50 513	54 499	272	295	99	53 908	54 562	288	295	92	45 357	49 103	6 3 4 2	6 900		
	Slovenia Spain	98 99	16 886 404 640	17 286 409 246	332 199	349 201	98 100	16 896 409 246	17 286 409 246	333 201	349 201	92 89	15 072 356 509	16 424 399 935	6 406 6 736	7 009 7 540		
	Sweden	100	93 819	94 097	202	205	100	93 819	94 097	202	205	91	82 582	91 081	5 458	6 013		
	Switzerland	93 97	75 482	81 026	212	232	98	79 481	81 375	225	232	92	74 465	80 544	5 838	6 305		
	Turkey United Kingdom	97 84	1 057 318 591 757	1 091 317 707 415	175 506	195 598	99 93	1 081 935 654 992	1 091 528 707 415	187 547	195 598	95 89	874 609 517 426	918 816 581 252	5 895 14 120	6 211 16 123		
	United States	67	2 601 386	3 902 089	142	213	83	3 244 399	3 893 828	177	213	90	2 629 707	2 929 771	5 712	6 376		
s	Albania	100	43 809	43 919	229	230	100	43 809	43 919	229	230	94	38 174	40 814	5 213	5 555		
rtne	Algeria Argentina	96 89	341 463 508 448	355 216 572 941	159 212	166 238	96 97	341 463 556 478	355 216 572 941	159 231	166 238	92 90	274 121 345 508	296 434 382 352	5 494 6 311	5 934 7 016		
Pa	Brazil	93	2 509 198	2 692 686	806	889	94	2 533 711	2 693 137	815	889	87	1 996 574	2 286 505	22 791	26 586		
	B-S-J-G (China) Bulgaria	88 100	1 259 845 56 265	1 437 201 56 483	248 179	268 180	100 100	1 437 652 56 600	1 437 652 56 600	268 180	268 180	97 95	1 287 710 50 931	1 331 794 53 685	9 841 5 928	10 097 6 240		
	Colombia	99	664 664	673 817	364	375	100	672 526	673 835	371	375	95	535 682	566 734	11 777	12 611		
	Costa Rica	99	66 485	67 073	204	206	99	66 485	67 073	204	206	92	47 494	51 369	6 846	7 411		
	Croatia Cyprus*	100 97	34 575 8 830	34 652 9 126	160 122	162 132	100 97	34 575 8 830	34 652 9 126	160 122	162 132	91 94	37 275 8 016	40 803 8 526	5 809 5 561	6 354 5 957		
	Dominican Republic	99	136 669	138 187	193	195	99	136 669	138 187	193	195	94	122 620	130 700	4 731	5 026		
	FYROM Georgia	100 97	16 426 40 552	16 472 41 595	106 256	107 267	100 99	16 426 41 081	16 472 41 566	106 262	107 267	95 94	14 999 35 567	15 802 37 873	5 324 5 316	5 617 5 689		
	Hong Kong (China)	75	45 603	60 716	115	153	90	54 795	60 715	138	153	93	48 222	51 806	5 3 5 9	5 747		
	Indonesia Jordan	98 100	3 126 468 119 024	3 176 076 119 024	232 250	236 250	100 100	3 176 076 119 024	3 176 076 119 024	236 250	236 250	98 97	3 015 844 105 868	3 092 773 108 669	6 513 7 267	6 694 7 462		
	Kazakhstan	100	202 701	202 701	232	232	100	202 701	202 701	232	232	97	187 683	192 921	7 841	8 059		
	Kosovo Lebanon	100 67	26 924 40 542	26 924 60 882	224 208	224 308	100 87	26 924 53 091	26 924 60 797	224 270	224 308	99 95	22 016 36 052	22 333 38 143	4 826 4 546	4 896 4 788		
	Lithuania	99	31 386	31 588	309	311	100	31 543	31 588	310	311	91	27 070	29 889	6 523	7 202		
	Macao (China) Malaysia	100 51	4 414 229 340	4 414 446 237	45 147	45 230	100 98	4 414 437 424	4 414 446 100	45 224	45 230	99 97	4 476 393 785	4 507 407 396	4 476 8 843	4 507 9 097		
	Malta	100	4 3 4 1	4 343	59	61	100	4 341	4 343	59	61	85	3 634	4 294	3 634	4 2 9 4		
	Moldova Montenegro	100 100	30 145 7 301	30 145 7 312	229 64	229 65	100 100	30 145 7 301	30 145 7 312	229 64	229 65	98 94	28 754 6 346	29 341 6 766	5 325 5 665	5 436 6 043		
	Peru	100	468 406	470 651	280	282	100	469 662	470 651	281	282	99	426 205	430 959	5 665 6 971	7 054		
	Qatar	99	13 333	13 470	166	168	99	13 333	13 470	166	168	94	12 061	12 819	12 061	12 819		
	Romania Russia	99 99	171 553 1 181 937	172 652 1 189 441	181 209	182 210	100 99	172 495 1 181 937	172 495 1 189 441	182 209	182 210	99 97	162 918 1 072 914	164 216 1 108 068	4 876 6 021	4 910 6 215		
	Singapore	97	45 299	46 620	175	179	98	45 553	46 620	176	179	93	42 241	45 259	6 105	6 555		
	Chinese Taipei Thailand	100 99	286 778 739 772	286 778 751 010	214 269	214 273	100 100	286 778 751 010	286 778 751 010	214 273	214 273	98 97	246 408 614 996	251 424 634 795	7 708 8 249	7 871 8 491		
	Trinidad and Tobago	92	15 904	17 371	141	163	92	15 904	17 371	141	163	79	9 674	12 188	4 587	5 745		
	Tunisia United Arab Emirates	99 99	121 751 49 310	122 767 50 060	162 473	165 477	99 99	121 838 49 310	122 792 50 060	163 473	165 477	86 95	97 337 43 774	112 665 46 263	5 340 14 167	6 175 15 014		
	Uruguay	98	42 986	43 737	217	221	99	43 442	43 737	219	221	86	32 762	38 023	6 059	7 026		
_	Viet Nam	100	996 757	996 757	188	188	100	996 757	996 757	188	188	100	871 353	874 859	5 826	5 849		

* See note at the beginning of this Annex. StatLink ang http://dx.doi.org/10.1787/888933433129



Grade levels

Students assessed in PISA 2015 are at various grade levels. The percentage of students at each grade level is presented by country in Table A2.4a and by gender within each country in Table A2.4b.

[Part 1/1]

						All st	udents					
	7th	grade	8th	grade	9th	grade	10th	grade	11th	grade	12th grade	e and abov
	%	S.E.	%	S.E.	%	S.E.	%	S.E.	%	S.E.	%	S.E.
Australia	0.0	(0.0)	0.1	(0.0)	11.2	(0.3)	74.6	(0.4)	14.0	(0.4)	0.1	(0.0)
Australia Austria Belgium	0.0	(0.0)	2.0	(0.6)	20.8	(0.9)	71.2	(1.0)	5.9	(0.3)	0.0	(0.0)
	0.6	(0.1)	6.4	(0.5)	30.7	(0.7)	61.0	(0.9)	1.3	(0.1)	0.0	(0.0)
Canada	0.1	(0.0)	0.7	(0.1)	10.8	(0.5)	87.6	(0.6)	0.8	(0.1)	0.0	(0.0)
Chile	1.7	(0.3)	4.1	(0.6)	24.0	(0.7)	68.1	(1.0)	2.1	(0.2)	0.0	(0.0)
Czech Republic Denmark	0.5	(0.1)	3.9	(0.3) (0.6)	49.4 81.9	(1.2) (0.7)	46.2	(1.2) (0.5)	0.0	(0.0) C	0.0	C C
Estonia	0.2	(0.1)	21.3	(0.6)	76.6	(0.7)	1.4	(0.3)	0.0	С	0.0	(0.0)
Finland	0.5	(0.2)	13.6	(0.0)	85.7	(0.0)	0.0	(0.0)	0.0	(0.1)	0.0	(0.0) C
France	0.0	(0.0)	1.0	(0.2)	23.1	(0.6)	72.5	(0.7)	3.2	(0.2)	0.0	(0.1)
Germany	0.5	(0.1)	7.7	(0.4)	47.3	(0.8)	43.1	(0.8)	1.5	(0.5)	0.0	(0.0)
Greece	0.2	(0.1)	0.7	(0.2)	3.8	(0.8)	95.3	(0.9)	0.0	(0.5) C	0.0	(0.0) C
Hungary	1.7	(0.3)	8.5	(0.5)	75.8	(0.7)	14.0	(0.5)	0.0	С	0.0	С
Iceland	0.0	С	0.0	С	0.0	С	100.0	С	0.0	С	0.0	С
Ireland	0.0	(0.0)	1.8	(0.2)	60.6	(0.7)	26.5	(1.1)	11.1	(0.9)	0.0	С
Israel	0.0	С	0.1	(0.0)	16.4	(0.9)	82.7	(0.9)	0.9	(0.3)	0.0	С
Italy	0.1	(0.0)	1.0	(0.2)	15.2	(0.6)	77.2	(0.7)	6.6	(0.3)	0.0	С
Japan	0.0	С	0.0	С	0.0	С	100.0	(0.0)	0.0	С	0.0	С
Korea	0.0	С	0.0	С	9.1	(0.8)	90.4	(0.8)	0.5	(0.1)	0.0	С
Latvia	0.9	(0.2)	11.7	(0.5)	84.4	(0.6)	2.9	(0.3)	0.0	(0.0)	0.0	C
Luxembourg	0.3	(0.1)	7.9	(0.1)	50.9	(0.1)	40.3	(0.1)	0.6	(0.0)	0.0	C
Mexico	2.3	(0.3)	4.8	(0.4)	31.9	(1.4)	60.3	(1.6)	0.5	(0.1)	0.2	(0.0)
Netherlands	0.1	(0.0)	2.8	(0.3)	41.6	(0.6)	54.8	(0.6)	0.8	(0.2)	0.0	(0.0)
New Zealand	0.0	С	0.0	C	0.0	(0.0)	6.2	(0.3)	88.8	(0.5)	5.0	(0.5)
Norway	0.0	C (0.1)	0.0	C (0, 2)	0.6	(0.1)	99.3	(0.2)	0.1	(0.1)	0.0	С
Poland	0.6	(0.1)	4.9	(0.3)	93.8	(0.4)	0.6	(0.2)	0.0	C (0.1)	0.0	С
Portugal Slovak Popublic	3.2	(0.3) (0.4)	8.4 4.6	(0.5) (0.4)	22.9 42.6	(0.9) (1.3)	65.1 50.6	(1.2) (1.2)	0.4	(0.1) (0.0)	0.0	С
Slovak Republic Slovenia	0.0	(0.4) C	0.3	(0.4)	42.0	(0.3)	94.6	(0.4)	0.1	(0.0)	0.0	C
Spain	0.0	(0.0)	8.6	(0.1)	23.4	(0.5)	67.9	(0.4)	0.3	(0.1)	0.0	C C
Sweden	0.1	(0.1)	3.1	(0.4)	94.9	(0.8)	1.8	(0.7)	0.1	(0.1)	0.0	c
Switzerland	0.5	(0.1)	11.8	(0.7)	61.3	(1.2)	25.9	(1.3)	0.5	(0.1)	0.0	(0.0)
Turkey	0.6	(0.1)	2.6	(0.4)	20.7	(1.0)	72.9	(1.2)	3.0	(0.3)	0.1	(0.0)
United Kingdom	0.0	C	0.0	C	0.0	C	1.6	(0.3)	97.4	(0.4)	1.0	(0.3)
United States	0.0	(0.0)	0.5	(0.3)	9.6	(0.7)	72.4	(0.9)	17.3	(0.6)	0.1	(0.0)
411 1												
Albania Algeria Brazil	0.2	(0.1)	1.0	(0.2)	35.8	(2.3)	61.7	(2.3)	1.2	(0.7)	0.0	(0.0)
Algeria	18.8 3.5	(1.0)	23.5	(1.1)	35.1	(1.5)	19.4 35.9	(2.1)	3.2 39.2	(0.7)	0.0	C (0.2)
Brazil B-S-J-G (China)	1.1	(0.2)	9.2	(0.4) (0.7)	52.7	(0.5) (1.7)	34.6	(0.9) (2.0)	2.2	(0.8) (0.5)	0.1	(0.2)
Bulgaria	0.5	(0.2)	3.0	(0.6)	92.2	(0.8)	4.3	(0.4)	0.0	(0.3) C	0.0	(0.0) C
Colombia	5.3	(0.2)	12.3	(0.6)	22.7	(0.6)	40.2	(0.7)	19.5	(0.6)	0.0	C
Costa Rica	6.2	(0.7)	14.0	(0.7)	33.0	(1.2)	46.5	(1.6)	0.2	(0.1)	0.1	(0.1)
Croatia	0.0	(0.7 <i>)</i>	0.2	(0.2)	79.2	(0.5)	20.6	(0.4)	0.0	(0.1) C	0.0	(0.1) C
Cyprus*	0.0	c	0.3	(0.0)	5.8	(0.1)	93.1	(0.1)	0.7	(0.1)	0.0	C
Dominican Republic	7.1	(0.8)	13.8	(1.2)	20.6	(0.8)	41.9	(1.1)	14.2	(0.7)	2.4	(0.3)
FYROM	0.1	(0.1)	0.1	(0.1)	70.2	(0.2)	29.7	(0.2)	0.0	С	0.0	С
Georgia	0.1	(0.0)	0.8	(0.2)	22.0	(0.8)	76.0	(0.9)	1.1	(0.3)	0.0	С
Hong Kong (China)	1.1	(0.1)	5.6	(0.4)	26.0	(0.7)	66.7	(0.7)	0.6	(0.5)	0.0	C
Indonesia	2.1	(0.3)	8.1	(0.7)	42.1	(1.5)	45.5	(1.6)	2.3	(0.4)	0.0	(0.0)
Jordan	0.2	(0.1)	0.6	(0.1)	6.6	(0.4)	92.6	(0.4)	0.0	С	0.0	C
Kosovo	0.0	(0.1)	0.6	(0.1)	24.9	(0.8)	72.4	(0.9)	2.1	(0.2)	0.0	C
Lebanon	3.7	(0.5)	8.3	(0.8)	16.6	(1.1)	62.3	(1.4)	9.0	(0.8)	0.1	(0.1)
Lithuania	0.1	(0.0)	2.6	(0.2)	86.3	(0.4)	11.0	(0.4)	0.0	(0.0)	0.0	C
Macao (China)	2.9	(0.1)	12.2	(0.2)	29.7	(0.2)	54.5	(0.1)	0.6	(0.1)	0.0	C
Malta	0.0	C (0, 1)	0.0	C	0.3	(0.1)	6.1	(0.2)	93.6	(0.1)	0.1	(0.0)
Moldova	0.2	(0.1)	7.6	(0.5)	84.5	(0.8)	7.5	(0.8)	0.0	(0.0)	0.0	C
Montenegro	0.0	C (0.2)	0.0	C (0, 4)	83.7	(0.1)	16.3	(0.1)	0.0	C (0, 8)	0.0	C
Peru Qatar	2.5	(0.3) (0.1)	6.6 3.5	(0.4)	15.9 16.3	(0.5) (0.1)	50.2 60.7	(0.8) (0.1)	24.8 18.0	(0.8) (0.1)	0.0	C (0.0)
Romania	1.4	(0.1)	8.9	(0.1) (0.5)	74.8	(0.1)	60.7	(0.1)	0.0	(0.1) C	0.6	(0.0) C
Russia	0.2	(0.3)	6.6	(0.3)	79.7	(0.9)	13.4	(0.7)	0.0	(0.0)	0.0	c
Singapore	0.2	(0.1)	1.9	(0.3)	7.9	(0.8)	90.0	(1.0)	0.1	(0.0)	0.0	(0.0)
Chinese Taipei	0.0	(0.0) C	0.0	(0.3) C	35.4	(0.7)	64.6	(0.7)	0.0	(0.0) C	0.0	(0.0) C
Thailand	0.0	(0.1)	0.6	(0.2)	23.8	(1.0)	72.9	(1.0)	2.4	(0.4)	0.0	C
Trinidad and Tobago	3.3	(0.2)	10.8	(0.2)	27.3	(0.3)	56.5	(0.3)	2.2	(0.2)	0.0	c
Tunisia	4.3	(0.2)	10.6	(0.8)	19.6	(1.3)	60.9	(1.7)	4.6	(0.2)	0.0	с
United Arab Emirates	0.6	(0.1)	2.5	(0.3)	10.6	(0.7)	53.4	(0.8)	31.4	(0.8)	1.5	(0.1)
Uruguay	7.5	(0.6)	9.7	(0.5)	20.7	(0.7)	61.3	(1.2)	0.8	(0.1)	0.0	C
Viet Nam	0.3	(0.1)	1.7	(0.4)	7.7	(1.8)	90.4	(2.2)	0.0	(0.0)	0.0	С
Argentina**	1.6	(0.4)	9.7	(0.8)	27.4	(1.2)	58.5	(1.6)	2.8	(0.3)	0.0	C
Kazakhstan**	0.1	(0.4)	2.7	(0.8)	60.4	(1.2)	36.2	(1.6)	0.6	(0.3)	0.0	c
	1 0.1	(0.1)	1 4./	(0.5)	1 00.7	(1.7)	1 30.4	(1.0)	1 0.0	(0.1)	0.0	C

* See note at the beginning of this Annex. ** Coverage is too small to ensure comparability (see Annex A4). StatLink and http://dx.doi.org/10.1787/888933433129



[Part 1/1]

Table A2.4b Percentage of students at each grade level

_		_	Boys												C									
				·		Boys			r					r			G	irls						
		741.		041.	d	041.		104		114			grade	741.		041-		041.		104 1-	114	d		grade
		7th g	·	L `	grade	<u> `</u>	grade	10th gra		11th			above		grade	8th g		· `	grade	10th grade		grade		above
		%	S.E.	%	S.E.	%	S.E.	% S	.E.	%	S.E.	%	S.E.	%	S.E.	%	S.E.	%	S.E.	% S.E.	%	S.E.	%	S.E.
8	Australia	0.0	(0.0)	0.2	(0.1)	13.2	(0.4)		.5)	13.1	(0.5)	0.0	(0.0)	0.0	(0.0)	0.1	(0.0)	9.2	(0.3)	75.7 (0.5)	14.9	(0.6)	0.1	(0.1)
OEC	Austria	0.1	(0.1)	2.0	(0.4)	21.6	(1.2)		.2)	5.2	(0.4)	0.0	(0.0)	0.0	C	2.0	(0.9)	20.0	(1.0)	71.4 (1.3)	6.6	(0.4)	0.0	(0.0)
0	Belgium	0.7	(0.1)	6.7	(0.5)	33.6	(1.0)		.1)	1.2	(0.2)	0.0	C	0.6	(0.1)	6.2	(0.5)	27.7	(0.8)	64.2 (1.1)	1.3	(0.1)	0.0	(0.0)
	Canada Chile	0.1	(0.1) (0.5)	1.0	(0.2) (0.8)	11.7 26.4	(0.6) (0.9)		0.6) .3)	0.7 1.8	(0.1) (0.2)	0.0	(0.0) (0.1)	0.1	(0.0) (0.4)	0.4	(0.1) (0.7)	9.9 21.5	(0.6) (0.8)	88.8 (0.6) 71.4 (1.1)	0.8	(0.1) (0.3)	0.0	(0.0)
	Czech Republic	0.6	(0.2)	5.5	(0.5)	52.3	(1.5)	41.5 (1		0.0	(0.2)	0.0	(0.1) C	0.4	(0.4)	2.2	(0.7)	46.2	(1.5)	51.2 (1.6)	0.0	(0.3) C	0.0	C C
	Denmark	0.3	(0.1)	21.9	(0.9)	76.6	(1.0)	1.2 (0		0.0	(0.0) C	0.0	С	0.1	(0.1)	10.8	(0.5)	87.3	(0.7)	1.7 (0.6)	0.0	С	0.0	С
	Estonia	1.3	(0.3)	23.7	(0.9)	74.2	(0.8)		.3)	0.0	c	0.0	(0.0)	0.2	(0.1)	18.8	(0.8)	79.1	(0.8)	1.9 (0.4)	0.0	С	0.0	C
	Finland	0.4	(0.1)	15.5	(0.6)	83.9	(0.6)		.0)	0.2	(0.1)	0.0	С	0.5	(0.1)	11.5	(0.5)	87.7	(0.5)	0.0 c	0.3	(0.2)	0.0	С
	France	0.0	С	1.0	(0.2)	26.1	(0.9)	69.6 (1	.0)	3.1	(0.3)	0.2	(0.1)	0.1	(0.1)	1.0	(0.2)	20.1	(0.6)	75.4 (0.8)	3.3	(0.3)	0.1	(0.0)
	Germany	0.7	(0.2)	9.0	(0.5)	50.1	(1.0)	38.8 (1	.0)	1.4	(0.4)	0.0	(0.0)	0.3	(0.1)	6.3	(0.6)	44.3	(0.9)	47.5 (1.0)	1.6	(0.6)	0.0	С
	Greece	0.4	(0.2)	1.1	(0.3)	4.7	(1.0)	93.8 (1		0.0	С	0.0	С	0.1	(0.1)	0.2	(0.1)	2.8	(0.8)	96.9 (0.8)	0.0	С	0.0	С
	Hungary	1.8	(0.4)	10.1	(0.6)	75.6	(0.9)		.6)	0.0	С	0.0	С	1.6	(0.4)	6.9	(0.8)	76.0	(0.9)	15.5 (0.7)	0.0	С	0.0	С
	Iceland	0.0	С	0.0	C	0.0	C	100.0	C	0.0	C (1 0)	0.0	С	0.0	C	0.0	C	0.0	C	100.0 c	0.0	C	0.0	С
	Ireland	0.0	C	2.2	(0.3) (0.1)	62.8 18.0	(0.9) (1.2)		.2)	10.9 1.1	(1.0)	0.0	С	0.0	(0.0)	1.4 0.1	(0.2) (0.0)	58.2	(0.9) (0.8)	29.0 (1.4) 84.4 (0.8)	11.3	(1.1) (0.1)	0.0	С
	Israel Italy	0.0	C (0.1)	1.3	(0.1)	18.1	(0.8)	80.9 (1 75.0 (0	.3)	5.4	(0.6) (0.4)	0.0	C C	0.0	C (0.0)	0.7	(0.0) (0.2)	14.9 12.2	(0.8)	84.4 (0.8) 79.3 (1.0)	7.7	(0.1)	0.0	C C
	Japan	0.2	(0.1) C	0.0	(0.3) C	0.0	(0.0) C	100.0	C	0.0	(U.4) C	0.0	c	0.0	(0.0) C	0.0	(0.2) C	0.0	(0.0) C	100.0 c	0.0	(0.3) C	0.0	C
	Korea	0.0	с	0.0	с	10.1	(1.4)		.4)	0.5	(0.1)	0.0	С	0.0	С	0.0	С	8.0	(0.8)	91.5 (0.8)	0.5	(0.1)	0.0	С
	Latvia	1.5	(0.4)	14.7	(0.8)	81.8	(0.9)		.3)	0.0	(0.0)	0.0	c	0.4	(0.2)	8.7	(0.7)	87.0	(0.7)	3.9 (0.4)	0.0	C	0.0	c
	Luxembourg	0.2	(0.1)	9.4	(0.2)	52.4	(0.3)	37.3 (0	.2)	0.7	(0.1)	0.0	С	0.3	(0.1)	6.4	(0.2)	49.4	(0.2)	43.3 (0.2)	0.6	(0.1)	0.0	С
	Mexico	3.1	(0.5)	5.9	(0.6)	32.2	(1.5)	58.0 (1	.6)	0.6	(0.2)	0.2	(0.0)	1.5	(0.3)	3.7	(0.4)	31.6	(1.7)	62.5 (1.7)	0.4	(0.1)	0.2	(0.1)
	Netherlands	0.0	(0.0)	3.8	(0.4)	45.3	(0.8)		.8)	0.8	(0.3)	0.0	С	0.1	(0.0)	1.9	(0.3)	38.0	(0.7)	59.3 (0.7)	0.7	(0.2)	0.0	(0.0)
	New Zealand	0.0	С	0.0	С	0.0	С			88.6	(0.8)	4.5	(0.5)	0.0	С	0.0	С	0.0	(0.0)	5.4 (0.4)	89.1	(0.6)	5.5	(0.6)
	Norway	0.0	С	0.0	С	0.8	(0.2)		.2)	0.1	(0.1)	0.0	С	0.0	С	0.0	С	0.3	(0.1)	99.6 (0.1)	0.1	(0.1)	0.0	С
	Poland	0.9	(0.2)	6.8	(0.5)	92.1	(0.6)		(.2)	0.0	C	0.0	С	0.4	(0.1)	3.0	(0.3)	95.6	(0.5)	1.1 (0.3)	0.0	C	0.0	С
	Portugal Slovak Republic	4.2	(0.4)	10.5	(0.7) (0.5)	25.4 43.5	(1.0)		.4)	0.3	(0.1)	0.0	С	2.1	(0.4)	6.4 4.3	(0.5) (0.6)	20.5 41.7	(0.9)	70.5 (1.2) 51.9 (1.8)	0.5	(0.1) (0.1)	0.0	С
	Slovenia	0.0	(0.4) C	4.8	(0.3)	5.4	(1.6) (0.7)	49.4 (1 93.9 (0	.0)	0.0	C (0.1)	0.0	C C	1.9 0.0	(0.5) C	0.2	(0.0)	41.7	(1.8) (0.6)	51.9 (1.8) 95.3 (0.6)	0.1	(0.1)	0.0	C C
	Spain	0.0	(0.1)	10.7	(0.2)	25.4	(0.7)	63.7 (1		0.2	(0.1)	0.0	c	0.0	c	6.5	(0.5)	21.3	(0.0)	72.1 (1.0)	0.1	(0.2)	0.0	c
	Sweden	0.1	(0.1)	3.5	(0.5)	95.0	(0.9)		.7)	0.1	(0.1)	0.0	с	0.2	(0.1)	2.6	(0.4)	94.9	(1.0)	2.3 (0.9)	0.1	(0.1)	0.0	С
	Switzerland	0.7	(0.2)	13.4	(0.8)	60.7	(1.1)		.2)	0.5	(0.1)	0.0	c	0.3	(0.1)	10.1	(0.8)	62.0	(1.7)	27.2 (1.9)	0.5	(0.2)	0.0	(0.0)
	Turkey	0.8	(0.3)	3.1	(0.6)	25.4	(1.2)	68.4 (1	.6)	2.2	(0.4)	0.1	(0.1)	0.4	(0.2)	2.1	(0.4)	16.1	(1.1)	77.5 (1.3)	3.8	(0.4)	0.1	(0.0)
	United Kingdom	0.0	С	0.0	С	0.0	С	1.9 (0	.5)	97.3	(0.6)	0.9	(0.3)	0.0	С	0.0	С	0.0	С	1.4 (0.2)	97.5	(0.3)	1.1	(0.3)
	United States	0.0	С	0.5	(0.4)	11.6	(0.8)	72.4 (1	.0)	15.3	(0.7)	0.2	(0.1)	0.1	(0.1)	0.5	(0.2)	7.6	(0.6)	72.4 (0.9)	19.4	(0.7)	0.1	(0.0)
50	Albania	0.2	(0.2)	0.9	(0.2)	41.2	(2.7)	56.3 (2	.6)	1.3	(0.9)	0.0	(0.0)	0.1	(0.1)	1.1	(0.3)	30.4	(2.1)	67.1 (2.2)	1.2	(0.5)	0.1	(0.0)
Partners	Algeria	24.4	(1.3)	25.7	(1.2)	32.6	(1.5)		.9)	2.6	(0.7)	0.0	C	12.6	(1.1)	21.0	(1.2)	37.9	(2.0)	24.6 (2.5)	3.9	(0.8)	0.0	C
art	Brazil	4.6	(0.3)	7.8	(0.6)	13.9	(0.6)			35.3	(0.9)	1.8	(0.2)	2.4	(0.2)	5.0	(0.4)	11.1	(0.6)	35.3 (0.9)	43.0	(0.9)	3.1	(0.2)
٩.	B-S-J-G (China)	1.2	(0.2)	9.9	(0.7)	55.4	(1.7)	31.6 (1	.9)	1.9	(0.5)	0.1	(0.0)	1.1	(0.2)	8.4	(0.8)	49.6	(1.8)	38.1 (2.2)	2.6	(0.5)	0.1	(0.1)
	Bulgaria	0.6	(0.2)	4.1	(0.8)	91.8	(1.0)		.4)	0.0	С	0.0	С	0.4	(0.2)	1.8	(0.4)	92.7	(0.7)	5.2 (0.4)	0.0	С	0.0	С
	Colombia	7.2	(0.6)	14.3	(0.8)	25.2	(0.8)			16.2	(0.8)	0.0	С	3.6	(0.4)	10.5	(0.7)	20.5	(0.9)	42.9 (1.0)	22.5	(0.8)	0.0	С
	Costa Rica	7.8	(0.8)	16.7	(0.8)	34.3	(1.2)		.5)	0.1	(0.0)	0.0	С	4.7	(0.7)	11.4	(0.7)	31.8	(1.4)	51.6 (1.8)	0.3	(0.1)	0.2	(0.1)
	Croatia	0.0	C	0.2	(0.1)	80.5	(0.5)	19.4 (0	_	0.0	C (0.1)	0.0	C	0.0	C	0.3	(0.2) (0.1)	78.0	(0.7)	21.7 (0.7) 93.8 (0.2)	0.0	C	0.0	C
	Cyprus* Dominican Republic	10.3	с (1.1)	16.4	(0.1) (1.5)	6.6 23.3	(0.2) (1.2)	92.4 (0 37.2 (1	(.2)	0.6 11.1	(0.1) (0.8)	0.0	C (0.3)	0.0	C (0.6)	0.3	(0.1) (1.1)	5.1 18.1	(0.2) (0.8)	93.8 (0.2) 46.5 (1.1)	0.8	(0.1) (0.8)	0.0 3.0	C (0.3)
	FYROM	0.2	(0.2)	0.2		70.9	(0.3)	28.8 (0		0.0	(0.0) C	0.0	(0. <i>J</i>)	0.0	(0.0) C	0.0	(1.1) C	69.4	(0.3)	30.6 (0.3)	0.0	(0.0) C	0.0	(0.3) C
	Georgia	0.1	(0.0)	0.9	(0.2)	23.0	(1.0)	75.2 (1		0.8	(0.2)	0.0	с	0.1	(0.1)	0.7	(0.2)	20.9	(0.9)	76.8 (1.0)	1.5	(0.4)	0.0	C
	Hong Kong (China)	1.3	(0.2)	6.4	(0.5)	28.5	(0.8)	63.3 (0		0.5	(0.4)	0.0	С	1.0	(0.2)	4.7	(0.4)	23.5	(0.8)	70.2 (0.9)	0.6	(0.6)	0.0	С
	Indonesia	2.5	(0.4)	8.9	(0.9)	44.3	(1.9)	42.1 (2	.0)	2.1	(0.4)	0.0	(0.0)	1.7	(0.3)	7.2	(1.0)	39.8	(1.9)	48.9 (2.1)	2.4	(0.4)	0.0	С
	Jordan	0.1	(0.1)	0.5	(0.1)	6.6	(0.7)		1.7)	0.0	С	0.0	С	0.2	(0.1)	0.7	(0.1)	6.6	(0.6)	92.4 (0.6)	0.0	С	0.0	С
	Kosovo	0.1	(0.1)	0.5	(0.1)	26.4	(0.9)	71.5 (1		1.6	(0.3)	0.0	C	0.0	C	0.7	(0.2)	23.5	(1.0)	73.3 (1.0)	2.5	(0.3)	0.0	C
	Lebanon Lithuania	4.0	(0.6)	8.2	(0.9) (0.3)	17.2 87.4	(1.4) (0.6)	63.5 (1 8.8 (0		6.9 0.0	(0.7) (0.0)	0.2	(0.1) C	3.4 0.0	(0.6) (0.0)	8.3	(1.0) (0.2)	16.1 85.1	(1.2) (0.7)	61.2 (1.8) 13.1 (0.6)	10.8	(1.2) (0.0)	0.1	(0.1) c
	Macao (China)	4.3	(0.1)	16.4	(0.3)	30.8	(0.8)		1.2)	0.0	(0.0)	0.0	c	1.6	(0.0)	8.0	(0.2)	28.7	(0.7)	60.8 (0.3)	0.0	(0.0)	0.0	С
	Malta	0.0	(0.2) C	0.0	(0.J) C	0.5	(0.2)			92.7	(0.1)	0.0	c	0.0	(0.2) C	0.0	(0.2) C	0.1	(0.0)	5.4 (0.2)	94.4	(0.2)	0.0	(0.1)
	Moldova	0.3	(0.1)	8.2	(0.7)	86.3	(0.9)		.9)	0.1	(0.1)	0.0	C	0.2	(0.1)	7.0		82.8	(1.2)	10.1 (1.2)	0.0	C	0.0	C
	Montenegro	0.0	С	0.0	С	85.2	(0.2)	14.8 (0		0.0	С	0.0	С	0.0	С	0.0	С	82.2		17.8 (0.2)	0.0	С	0.0	С
	Peru	3.0	(0.5)	7.5	(0.5)	17.9	(0.7)	48.7 (0	.9)	22.9	(1.0)	0.0	С	1.9	(0.3)	5.6	(0.5)	14.0		51.7 (1.0)	26.8	(0.9)	0.0	С
	Qatar	0.8	(0.1)	3.6	(0.1)	18.0	(0.2)	59.3 (0		17.6	(0.2)	0.6	(0.1)	1.0	(0.1)	3.4	(0.1)	14.5	(0.1)	62.1 (0.2)	18.4	(0.2)	0.6	(0.1)
	Romania	1.7	(0.4)	10.7		74.3	(1.0)	13.3 (0		0.0	С	0.0	С	1.1	(0.4)		(0.8)	75.3	(1.1)	16.4 (0.8)	0.0	С	0.0	С
	Russia	0.2	(0.1)		(0.5)	80.1		12.4 (1		0.0	(0.0)	0.0	C	0.1	(0.1)		(0.4)	79.3		14.4 (1.6)	0.1	(0.1)	0.0	C
	Singapore	0.1	(0.0)		(0.3)		(0.9)	89.1 (1		0.1	(0.1)	0.0	(0.0)	0.0	(0.0)		(0.4)	6.9		90.8 (1.1)	0.2	(0.1)	0.1	(0.0)
	Chinese Taipei	0.0	C	0.0	C	36.5		63.5 (1		0.0	C	0.0	C	0.0	C	0.0	C	34.3	(1.3)	65.7 (1.3)	0.0	C	0.0	С
	Thailand Trinidad and Tobago	0.2	(0.1) (0.3)	0.8	(0.3) (0.5)	25.4 30.8	(1.2)	71.4 (1 48.9 (0		2.3 2.4	(0.4) (0.2)	0.0	C	0.3	(0.1) (0.2)	0.5	(0.2) (0.4)	22.5 23.8	(1.3) (0.4)	74.1 (1.3) 63.9 (0.5)	2.6	(0.4)	0.0	С
	Tunisia	5.9	(0.3)	14.2		22.0	(0.5) (1.4)	54.0 (1			(0.2)	0.0	C C	3.0	(0.2)	7.8	(0.4) (0.7)	17.5	(0.4)	67.0 (1.8)	4.8	(0.3) (0.5)	0.0	C C
	United Arab Emirates	0.7	(0.3)		(0.4)	11.4		54.0 (1			(1.0)	1.4	(0.2)	0.4	(0.3)		(0.7)	9.9	(0.9)	52.8 (0.9)	33.1	(1.1)	1.6	(0.2)
	Uruguay	9.2	(0.1)				(0.9)	56.5 (1		0.5	(0.1)	0.0	(0.2) C	6.0	(0.7)		(0.6)	19.0		65.6 (1.1)	1.1	(0.2)	0.0	(0.2) C
	Viet Nam	0.5	(0.2)	2.3	(0.6)		(2.6)	86.1 (3		0.0	(0.1) C	0.0	C	0.1	(0.0)		(0.4)	4.6	(1.2)	94.2 (1.4)	0.0	(0.0)	0.0	С
	Argentina**	2.3	(0.6)	11.5		27.8	(1.3)	56.0 (1		2.4	(0.3)	0.0	C	1.0	(0.3)	8.1	(0.9)	26.9	(1.4)	60.8 (1.7)	3.2	(0.3)	0.0	C
	Kazakhstan**	0.1	(0.6)	3.1	(0.9)	62.8	(1.3)	33.5 (2			(0.3)	0.0	c	0.1	(0.3)	2.3	(0.9)	57.8		39.0 (1.8)	0.7	(0.3)	0.0	C
	Malaysia**	0.0	(0.1) C	0.0	(0.4) C	4.2	(0.8)	95.4 (0			(0.1)	0.0	c	0.0	(0.1) C	0.0	(0.3) C		(0.5)	97.2 (0.6)		(0.1)	0.0	С
_		0.0	C	0.0			(0.0)	0.1 (0	. 91	0.1	,0.0/	0.0	C	0.0	C	0.0	- U	2.5	(0.5)	J (0.0)	. 0.1	(0.1)	0.0	

* See note at the beginning of this Annex. ** Coverage is too small to ensure comparability (see Annex A4). StatLink @59 http://dx.doi.org/10.1787/888933433129

Reference

OECD (2017), PISA 2015 Technical Report, PISA, OECD Publishing, Paris.

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ANNEX A3 TECHNICAL NOTES ON ANALYSES IN THIS VOLUME

Methods and definitions

Relative performance in collaborative problem solving

Relative performance in collaborative problem solving is defined as the difference between a student's actual performance in collaborative problem solving and his or her expected performance, based on performance in other domains:

$$RP_i^{cps} = y_i^{cps} - E(y_i^{cps} \mid y_i^{srm})$$

where y_i^{cps} represents student *i*'s performance in collaborative problem solving, and y_i^{srm} is a vector of student *i*'s performance in other domains (such as science, reading and mathematics).

A student's (conditionally) expected performance is estimated using regression models; relative performance is therefore based on residuals from regression models. All analyses of relative performance in this volume derive residuals from linear parametric regression models. However, different regression methods can be used, including ones that allow for curvilinear relationships and non-parametric regression models.

In some analyses, the regression model is calibrated on an international sample of students, in order to compare students' performance across countries. In others, when differences between different groups of students within the same country or economy (for example, within-country gender differences or the relationship between performance and the certain out-of-school student activities), the regression model is calibrated on national samples. In all cases, ten distinct regression models are estimated to compute ten plausible values of relative performance.

Relative risk

The relative risk is a measure of the association between an antecedent factor and an outcome factor. The relative risk is simply the ratio of two risks, i.e. the risk of observing the outcome when the antecedent is present and the risk of observing the outcome when the antecedent is not present. Figure A3.1 presents the notation that is used in the following.

Tigule A3.1 = La	ibels used in a t	wo-way table	
$p_{_{11}}$	<i>p</i> ₁₂	<i>p</i> _{1.}	
$p_{_{21}}$	$p_{_{22}}$	<i>p</i> _{2.}	
<i>P</i> .1	<i>P</i> _{.2}	р	

Figure A3.1	Labels	used in a	a two-way	table	
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 P_{ij} represents the probabilities for each cell and is equal to the number of observations in a particular cell divided by the total number of observations. $P_{i.}$, $P_{j.}$ respectively represent the marginal probabilities for each row and for each column. The marginal probabilities are equal to the marginal frequencies divided by the total number of students.

Assuming that rows represent the antecedent factor, with the first row for "having the antecedent" and the second row for "not having the antecedent", and that the columns represent the outcome: the first column for "having the outcome" and the second column for "not having the outcome", the relative risk is then equal to:

$$RR = \frac{(p_{11}/p_{1.})}{(p_{21}/p_{2.})}$$

Odds ratio

The same notation can be used to define the odds ratio, another measure of the relative likelihood of a particular outcome across two groups. The odds ratio for observing the outcome when an antecedent is present is simply

$$OR = \frac{(p_{11}/p_{12})}{(p_{21}/p_{22})}$$

where p_{11}/p_{12} represents the "odds" of observing the outcome when the antecedent is present, and p_{21}/p_{22} represents the "odds" of observing the outcome when the antecedent is not present.

A logistic regression can be used to estimate the odds ratio: the exponentiated logit coefficient for a binary variable is equivalent to the odds ratio. A "generalised" odds ratio, after accounting for other differences across groups, can be estimated by introducing control variables in the logistic regression.



Statistics based on multilevel models

Statistics based on multilevel models include variance components (between- and within-school variance), the index of intraclass correlation derived from these components, and regression coefficients where this has been indicated. Multilevel models are generally specified as two-level regression models (the student and school levels), with normally distributed residuals, and estimated with maximum likelihood estimation. Where the dependent variable is science, reading, mathematics or collaborative problem-solving performance, the estimation uses ten plausible values for each student's performance on the performance scale. Models were estimated using the Stata ® (version 14.1) "mixed" module.

In multilevel models, weights are used at both the student and school levels. The purpose of these weights is to account for differences in the probabilities of students being selected in the sample. Since PISA applies a two-stage sampling procedure, these differences are due to factors at both the school and the student levels. For the multilevel models, student final weights (W_FSTUWT) were used. Students' within-school weights correspond to student final weights, rescaled to amount to the sample size within each school. School weights correspond to the sum of final student weights (W_FSTUWT) within each school. This definition of school weights is the same used in the PISA 2012 Initial Report.

The index of intra-class correlation is defined and estimated as:

$$100^* \frac{\sigma_w^2}{\sigma_w^2 + \sigma_b^2}$$

where σ_w^2 and σ_b^2 , respectively, represent the within- and between-variance estimates.

The results in multilevel models, and the between-school variance estimate in particular, depend on how schools are defined and organised within countries and by the units that were chosen for sampling purposes. For example, in some countries, some of the schools in the PISA sample were defined as administrative units (even if they spanned several geographically separate institutions, as in Italy); in others they were defined as those parts of larger educational institutions that serve 15-year-olds; in still others they were defined as physical school buildings; and in others they were defined from a management perspective (e.g. entities having a principal). The *PISA 2015 Technical Report* (OECD, 2017) and Annex A2 provide an overview of how schools are defined. In Slovenia, for example, the primary sampling unit is defined as a group of students who follow the same study programme within a school (an education track within a school). So in this case, the between-school variation is actually the within-school, between-track difference. The use of stratification variables in the selection of schools may also affect the estimate of the between-school variation, particularly if stratification variables are associated with between-school differences.

Because of the manner in which students were sampled, the within-school variation includes variation between classes as well as between students.

Effect sizes

Sometimes it is useful to compare differences in an index between groups, such as boys and girls, across countries. A problem that may occur in such instances is that the distribution of the index varies across groups or countries. One way to resolve this is to calculate an effect size that accounts for differences in the distributions. An effect size measures the difference between, say, the collaborative problem-solving performance of male and female students in a given country, relative to the average variation in collaborative problem-solving performance among all students in the country.

The effect size between two subgroups is calculated as:

$$\frac{m_1 - m_2}{\sqrt{\sigma^2}}$$

where m_1 and m_2 , respectively, represent the mean values for the subgroups 1 and 2 and σ^2 represents the overall (between and within-group) variance.

Concentration of immigrant students

The concentration of immigrant students in schools is equal to the share of students in a school who are immigrants. It is defined as:

$$C_i = \frac{N_i^{immig}}{N_i^{immig} + N_i^{non-immig}}$$

with N_i^{inmig} equal to the number of immigrant students in school i and $N_i^{non-immig}$ equal to the number of non-immigrant students in school *i*.

Similar concentration indices were defined for advantaged students (those students in the top quarter of the PISA index for economic, social and cultural status [ESCS] in their country or economy), disadvantaged students (those students in the bottom quarter of ESCS in their country or economy) and students who speak a different language at home. The proportion of students with special needs in a school was reported by school principals.



Standard errors and significance tests

The statistics in this report represent estimates of national performance based on samples of students, rather than values that could be calculated if every student in every country had answered every question. Consequently, it is important to measure the degree of uncertainty of the estimates. In PISA, each estimate has an associated degree of uncertainty, which is expressed through a standard error. The use of confidence intervals provides a way to make inferences about the population means and proportions in a manner that reflects the uncertainty associated with the sample estimates. From an observed sample statistic and assuming a normal distribution, it can be inferred that the corresponding population result would lie within the confidence interval in 95 out of 100 replications of the measurement on different samples drawn from the same population.

In many cases, readers are primarily interested in whether a given value in a particular country is different from a second value in the same or another country, e.g. whether girls in a country perform better than boys in the same country. In the tables and charts used in this report, differences are labelled as statistically significant when a difference of that magnitude or larger would be observed less than 5% of the time, if there were actually no difference in corresponding population values. Similarly, the risk of reporting a correlation as significant if there is, in fact, no correlation between two measures, is contained at 5%.

Throughout the report, significance tests were undertaken to assess the statistical significance of the comparisons made.

Gender differences and differences between subgroup means

Gender differences in student performance or other indices were tested for statistical significance. Positive differences indicate higher scores for boys while negative differences indicate higher scores for girls. Generally, differences marked in bold in the tables in this volume are statistically significant at the 95% confidence level.

Similarly, differences between other groups of students (e.g. non-immigrant students and students with an immigrant background) or categories of schools (e.g. advantaged and disadvantaged schools) were tested for statistical significance. The definitions of the subgroups can, in general, be found in the tables and the text accompanying the analysis. Socio-economically (dis) advantaged school are defined as schools in the (bottom) top quarter of the distribution of the average PISA index of economic, social and cultural status (ESCS) across schools within each country/economy. All differences marked in bold in the tables presented in Annex B of this report are statistically significant at the 95% level.

Differences between subgroup means, after accounting for other variables

For many tables, subgroup comparisons were performed both on the observed difference ("before accounting for other variables") and after accounting for other variables, such as the PISA index of economic, social and cultural status of students, gender, and performance in the three core PISA domains of science, reading and mathematics. The adjusted differences were estimated using linear regression and tested for significance at the 95% confidence level. Significant differences are marked in bold.

Performance differences between the top and bottom quartiles of PISA indices and scales

Differences in average performance between the top and bottom quarters of the PISA indices and scales were tested for statistical significance. Figures marked in bold indicate that performance between the top and bottom quarters of students on the respective index is statistically significantly different at the 95% confidence level.

Change in the performance per unit of the index

For many tables, the difference in student performance per unit on the index shown was calculated. Figures in bold indicate that the differences are statistically significantly different from zero at the 95% confidence level.

Relative risk and odds ratio

Figures in bold in the data tables presented in Annex B of this report indicate that the relative risk/odds ratio is statistically significantly different from 1 at the 95% confidence level. To compute statistical significance around the value of 1 (the null hypothesis), the relative-risk/odds-ratio statistic is assumed to follow a log-normal distribution, rather than a normal distribution, under the null hypothesis.

For many tables, "generalised" odds ratios (after accounting for other variables) are also presented. These odds ratios were estimated using logistic regression and tested for significance against the null hypothesis of an odds ratio equal to 1 (i.e. equal likelihoods, after accounting for other variables).

Range of ranks

To calculate the range of ranks for countries, data are simulated using the mean and standard error of the mean for each relevant country to generate a distribution of possible values. Some 10 000 simulations are implemented and, based on these values, 10 000 possible rankings for each country are produced. For each country, the counts for each rank are aggregated from largest to smallest until they equal 9 500 or more. Then the range of ranks per country is reported, including all the ranks that have been aggregated. This means that there is at least 95% confidence about the range of ranks, and it is safe to assume unimodality in this distribution of ranks. This method has been used in all cycles of PISA since 2003, including PISA 2015.



The main difference between the range of ranks (e.g. Figure V.3.4) and the comparison of countries' mean performance (e.g. Figure V.3.3) is that the former takes account of the multiple comparisons involved in ranking countries/economies, while the latter does not. Therefore, sometimes there is a slight difference between the range of ranks and counting the number of countries above a given country, based on pairwise comparisons of the selected countries' performance. For instance, Canada and Finland have similar mean performance and the same set of countries whose mean score is not statistically different from theirs, based on Figure V.3.3; but the rank for Canada can be restricted to be, with 95% confidence, between 2nd and 6th among OECD countries, while the range of ranks for Finland is wider (between 2nd and 7th) (Figure V.3.4). Since it is safe to assume that the distribution of rank estimates for each country has a single mode (unimodality), the results of range of ranks for countries should be used when examining countries' rankings.

Standard errors in statistics estimated from multilevel models

For statistics based on multilevel models (such as the estimates of variance components and regression coefficients from two-level regression models) the standard errors are not estimated with the usual replication method, which accounts for stratification and sampling rates from finite populations. Instead, standard errors are "model-based": their computation assumes that schools, and students within schools, are sampled at random (with sampling probabilities reflected in school and student weights) from a theoretical, infinite population of schools and students which complies with the model's parametric assumptions.

The standard error for the estimated index of intra-class correlation is calculated by deriving an approximate distribution for it from the (model-based) standard errors for the variance components, using the delta-method.

References

OECD (2017), PISA 2015 Technical Report, PISA, OECD Publishing, Paris.



Quality assurance procedures were implemented in all parts of PISA 2015, as was done for all previous PISA surveys. The PISA 2015 Technical Standards (www.oecd.org/pisa) specify the way in which PISA must be implemented in each country, economy and adjudicated region. International contractors monitor the implementation in each of these and adjudicate on their adherence to the standards.

The consistent quality and linguistic equivalence of the PISA 2015 assessment instruments were facilitated by assessing the ease with which the original English version could be translated. Two source versions of the assessment instruments, in English and French were prepared (except for the financial literacy assessment and the operational manuals, which were provided only in English) in order for countries to conduct a double translation design, i.e. two independent translations from the source language(s), and reconciliation by a third person. Detailed instructions for the localisation (adaptation, translation and validation) of the instruments for the field trial and for their review for the main survey, and translation/adaptation guidelines were supplied. An independent team of expert verifiers, appointed and trained by the PISA Consortium, verified each national version against the English and/or French source versions. These translators' mother tongue was the language of instruction in the country concerned, and the translators were knowledgeable about education systems. For further information on PISA translation procedures, see the *PISA 2015 Technical Report* (OECD, 2017).

The survey was implemented through standardised procedures. The PISA Consortium provided comprehensive manuals that explained the implementation of the survey, including precise instructions for the work of school co-ordinators and scripts for test administrators to use during the assessment sessions. Proposed adaptations to survey procedures, or proposed modifications to the assessment session script, were submitted to the PISA Consortium for approval prior to verification. The PISA Consortium then verified the national translation and adaptation of these manuals.

To establish the credibility of PISA as valid and unbiased and to encourage uniformity in administering the assessment sessions, test administrators in participating countries were selected using the following criteria: it was required that the test administrator not be the science, reading or mathematics instructor of any students in the sessions he or she would conduct for PISA; and it was considered preferable that the test administrator not be a member of the staff of any school in the PISA sample. Participating countries organised an in-person training session for test administrators.

Participating countries and economies were required to ensure that test administrators worked with the school co-ordinator to prepare the assessment session, including reviewing and updating the Student Tracking Form; completing the Session Attendance Form, which is designed to record students' attendance and instruments allocation; completing the Session Report Form, which is designed to summarise session times, any disturbance to the session, etc.; ensuring that the number of test booklets and questionnaires collected from students tallied with the number sent to the school (paper-based assessment countries) or ensuring that the number of USB sticks used for the assessment were accounted for (computer-based assessment countries); and sending the school questionnaire, student questionnaires, parent and teacher questionnaires (if applicable), and all test materials (both completed and not completed) to the national centre after the testing.

The PISA Consortium responsible for overseeing survey operations implemented all phases of the PISA Quality Monitor (PQM) process: interviewing and hiring PQM candidates in each of the countries, organising their training, selecting the schools to visit, and collecting information from the PQM visits. PQMs are independent contractors located in participating countries who are hired by the international survey operations contractor. They visit a sample of schools to observe test administration and to record the implementation of the documented field-operations procedures in the main survey.

Typically, two or three PQMs were hired for each country, and they visited an average of 15 schools in each country. If there were adjudicated regions in a country, it was usually necessary to hire additional PQMs, as a minimum of five schools were observed in adjudicated regions.

All quality-assurance data collected throughout the PISA 2015 assessment were entered and collated in a central dataadjudication database on the quality of field operations, printing, translation, school and student sampling, and coding. Comprehensive reports were then generated for the PISA Adjudication Group. This group was formed by the Technical Advisory Group and the Sampling Referee. Its role is to review the adjudication database and reports to recommend adequate treatment to preserve the quality of PISA data. For further information, see the *PISA 2015 Technical Report* (OECD, 2017).

The results of adjudication and subsequent further examinations showed that the PISA Technical Standards were met in all countries and economies that participated in PISA 2015 collaborative problem-solving assessment except for Malaysia where the PISA assessment was conducted in accordance with the operational standards and guidelines of the OECD. However, the weighted response rate among the initially sampled Malaysian schools (51%) falls well short of the standard PISA response rate of 85%. Therefore, the results may not be comparable to those of other countries or to results for Malaysia from previous years.

Reference

OECD (2017), PISA 2015 Technical Report, PISA, OECD Publishing, Paris.



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