

# Supplementary Material

### Supplementary Table 1. Variables used.

Variable	Operationalization	Time of measurement
Immigrant background	0 = Students and parents born in Germany, $1 =$ Students immigrated	Grade 9, wave 1
	themselves, have at least one foreign-born parent (second-generation	
	migrants) or have at least two grandparents who were born outside of	
	Germany	
Generational status	0 = Students and parents born in Germany, $1 =$ one or both parents	Grade 9, wave 1
	born abroad = 1 (second-generation); 2 = Students born abroad (first-	
	generation)	
Social background		
Parents' highest educational	Parents' highest ISCED level: 0 = ISCED level 0-2, 1 = ISCED level	Grade 9, wave 1 (if
level	3-4, 2= ISCED level 5-6.	missing, wave 5 or 7)
		Parents'
		questionnaire, if
		missing, information
		from the student.
Parents' highest socio-	International Socio-Economic Index of Occupational Status (ISEI-08)	See parents' highest
economic status		educational level
Prior achievement		
GPA in Grade 9 or 10	Average of students' (self-reported) grade in Maths and German on	Grade 9 (wave 1)
	annual report card in Grade 9; scaled from 1 (best) to 6 (worst Grade)	
	If students left the general school system after lower-secondary	
	education, their self-reported average grade on school-leaving report	At time of leaving
	was used (if missing: grade point average in Maths and German from	lower-secondary
	the last report card), scaled from 1 (best) to 6 (worst grade); if students	education
	continued school after lower-secondary education, the average of	
	students' self-reported grade on school-leaving report was used	
Competence score in Maths	Estimated WLE score	Grade 9 (wave 1),
		Grade 12 (wave 7)
Competence score in Reading	Estimated WLE score	Grade 9 (wave 1),
		Grade 12 (wave 7)
Competence score in ICT-	Estimated WLE score	Grade 9 (wave 1),
Literacy		Grade 12 (wave 7)

Variable	Operationalization	Time of measurement
Educational and occupational a	spirations	
Students' educational	Item (Grade 9): If it were up to you: What would you prefer to do after	Grade 9, wave 1 (if
aspirations	9th Grade? I would prefer to 1 = do a company- or school-based	missing, wave 2)
	vocational training, $2 =$ continue going to school, $0 =$ else (attend pre-	
	vocational training programs, go on an internship, work for a while, go	
	abroad, do none of those things).	
	Item (Grade 12/13): If you could do anything you want, what type of	Grade 12 or 13, wave
	vocational training would you most like to do after finishing school?	7 (if missing, wave 8)
	1 = do a company- or school-based vocational training, 2 = higher	
	education, $0 =$ else (attend pre-vocational training programs, go on an	
	internship, work for a while, go abroad, do none of those things).	
Students' occupational	Item: 'Imagine you had every chance to become whatever you wanted.	Grade 9, wave 1 (if
aspirations	What would your dream job be?' (ISEI score)	missing, wave 2);
		Grade 12 or 13, wave
		7 (if missing, wave 8)
Parental educational aspirations	Item: And what kind of education would your parents like you to get	Grade 9, wave 1
as perceived by students	after you have left school? My parents would like me to 1 = do no	
1 5	vocational training at all, $2 = do$ a vocational training, $3 = study$ , $0 =$	
	my parents have no opinion.	
	Item: What vocational training course do your parents want you to do	Grade 12 or 13, wave
	after you leave school? My parents would like me to 1 = do a	7 (if missing, wave 8)
	vocational training, $2 = $ study, $0 = $ my parents have no opinion.	× 0, ,
Variables used in robustness che	rcks	
Robustness check 1a: Added HO	MEPOS scale as an additional indicator for social background	
Index of Home Possessions	Scale including 8 household items (a desk to study, own room, learning	9th Grade, wave 1 (if
(HOMEPOS)	software, classic literature, books with poems, works of art, books that	missing, wave 2)
	are useful for homework, a dictionary)	
Robustness check 1b: Replaced p	arents' HISEI by parents' EGP class	
Parents' EGP class	Parents' highest EGP class: 0 = Working class – (IIIb, VI, VIIab); 1 =	See parents' highest
	Mixed class (IIIa, IVabc, V); 2 = Service class (I+II)	educational level
Robustness check 1c: Replaced p	arents' CASMIN with parents' ISCED	
Parents' ISCED level	0 = low (without any educational certificate, with a low or intermediate	See parents' highest
	secondary school certificate but without VET qualification),	educational level
	1 = intermediate (lower secondary school certificate and a VET	
	qualification, an intermediate secondary school certificate and a VET	
	qualification or a university entrance qualification but no VET	
	qualification), $2 = high$ (university degree or university of applied	
	science degree)	

## Supplementary Table 1 (continued)

Variable	Operationalization	Time of measurement
Robustness check 2: Added measu	res for anticipated discrimination and information deficits as additional co	ontrol variables
Anticipated discrimination	Four-item scale about the probability of discrimination if one 1) has a	Wave 2
	name that sounds foreign, 2) has a foreign look, 3) wears a headscarf or	
	4) does not speak German so well when applying for vocational	
	education, answers ranged from $1 = no$ , $2 = rather no$ , $3 = rather yes$ , 4	
	= yes)	
Social resources: Receive	Item: How likely is it that people in your life would let you know about	Wave 2 (if missing,
information on interesting	interesting open vocational training positions?, $1 = very unlikely, \rightarrow$	wave 3)
vocational training positions	4 = very likely	
Social resources: Receive help Item: 'How likely is it that someone in your life would get involved in		Wave 2 (if missing,
to get a vocational training	helping you get a vocational training position?', 1 = very unlikely, $\rightarrow$	wave 3)
position	4 = very likely	
Robustness check 3: Restricted im	migrant background to (children of) immigrants up to the third generation	
Immigrant background	0 = Students and parents born in Germany, $1 =$ Students immigrated	Grade 9, wave 1
	themselves or have at least one foreign-born parent or have at least two	
	grandparents who were born outside of Germany	
Controls		
Gender	0 = male, 1 = female	Grade 9, wave 1
School track in Grade 9	0 = special school (Förderschule), 1 = Hauptschule, 2 = Realschule,	Grade 9, wave 1
	3 = cominbed school with missing information on branch, $4 =$	
	comprehensive school (Gesamtschule), 5 = free Waldorf school,	
	6 = Gymnasium, $7 = other schools$ .	

## Supplementary Table 1 (continued)

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	Natives	Immigrants	All	% Missing
Generational status (%)		0		0.0%
No immigrant background	100.0%	_	76.5%	
Second-generation immigrants	_	78.0%	18.3%	
First-generation immigrants	_	22.0%	5.2%	
Ethnic origin (%)				0.0%
Germany	100.0%	_	76.5%	
Turkey	_	19.8%	4.7%	
Other labor immigrants	_	10.3%	2.4%	
Poland	_	10.5%	2.5%	
Former Soviet Union	_	18.8%	4.4%	
Other	_	40.5%	9.5%	
Prior achievement Grade 9/10				
Competence score in Maths	0.23	-0.26	0.11	8.7%
Competence score in Reading	0.19	-0.35	0.06	11.9%
Competence score in ICT-Literacy	0.17	-0.22	0.08	8.9%
GPA in Maths and German on	2.87	3.04	2.91	7.6%
annual report card in Grade 8				
GPA in Grade 9 or 10	2.66	2.79	2.69	5.8%
Aspirations				
Occupational aspirations (ISEI) Grade 9	60.88	63.48	61.49	25.6%
Educational aspirations (%) Grade 9				14.0%
Do something different	23.2%	19.6%	22.4%	
VET	20.3%	20.7%	20.4%	
Continue school	56.5%	59.7%	57.2%	
Parents' educational aspirations				15 20/
as perceived by students (%) Grade 9/10				13.2%
No opinion	12.1%	7.0%	10.9%	
No vocational training	0.6%	1.0%	0.7%	
VET	46.8%	37.7%	44.6%	
University	40.6%	54.3%	43.0%	
Control variables				
Sex (% Female)	49.0%	50.9%	49.5%	0.0%
Parents' highest ISEI	54.74	44.42	52.32	9.8%
Parents' highest ISCED (%)				15.5%
ISCED 0-2	3.1%	21.4%	7.4%	
ISCED 3-4	37.4%	47.4%	39.8%	
ISCED 5-6	59.5%	31.2%	52.8%	
Number of observations (row per cent)	76.0%	24.0%	100.0%	0.0%
Number of observations (unweighted)	8,767	2,769	11,536	

**Supplementary Table 2.** Descriptive statistics of the sample in Grade 9.

*Notes.* Imputed data (m = 25). Unweighted number of cases, weighted and imputed percentages and means.

	Natives	Immigrants	All	%
		_		Missing
Generational status (%)				0.0%
No immigrant background	100.0%	_	79.7%	
Second-generation immigrants	_	83.0%	16.9%	
First-generation immigrants	_	17.0%	3.4%	
Ethnic origin (%)				0.0%
Germany	100.0%	_	79.7%	
Turkey	-	15.1%	3.1%	
Other labor immigrants	_	9.6%	1.9%	
Poland	_	11.4%	2.3%	
Former Soviet Union	-	14.9%	3.0%	
Other	-	49.1%	10.0%	
Prior achievement Grade 12/13				
Competence score in Maths	0.31	-0.10	0.23	28.1%
Competence score in Reading	0.34	0.02	0.27	27.3%
Competence score in ICT-Literacy	0.94	0.68	0.89	27.3%
GPA on school-leaving certificate	2.37	2.48	2.39	0.6%
Aspirations				
Occupational aspirations (ISEI) Grade 12/13	70.30	72.81	70.77	24.7%
Educational aspirations (%) Grade 12/13				16.1%
Do something different	3.4%	7.2%	4.2%	
VET	18.6%	15.8%	18.0%	
University	78.0%	77.0%	77.8%	
Parents' educational expectations				8.6%
as perceived by students (%) Grade 11				
No opinion	23.7%	18.7%	22.7%	
VET	4.2%	3.5%	4.1%	
University	72.1%	77.8%	73.2%	
Control variables				
Sex (% Female)	53.8%	56.4%	54.4%	0.0%
Parents' highest ISEI	62.97	54.87	60.92	2.3%
Parents' highest ISCED (%)				4.8%
ISCED 0-2	0.7%	12.3%	3.1%	
ISCED 3-4	23.4%	42.0%	27.2%	
ISCED 5-6	75.9%	45.7%	69.7%	
Number of observations (row per cent)	79.7%	20.3%	100.0%	0.0%
Number of observations (unweighted)	3,919	941	4,860	

Supplementary Table 3. Descriptive statistics on the sample in the final year (Grade 12 or 13).

*Notes.* Includes only respondents enrolled in an academic track until Grade 12 or 13 and successfully completed this track with an upper-secondary degree. Imputed data (m = 25). Unweighted number of cases, weighted and imputed percentages and means.

	<b>ER1:</b>	ER2:		ER3: Enro	llment after	
	Enrollment	Enrollment	Enrollment after lower-secondary		upper-se	econdary
	in Grade 9		education			ation <sup>4</sup>
	Academic track	Academic track <sup>1</sup>	Upper- secondary vocational school <sup>2</sup>	VET <sup>3</sup>	Higher education	VET <sup>3</sup>
Immigrant background (Ref.: natives)	0.000	0.012	0.029***	-0.050***	0.049**	-0.037**
Social background Parents' highest ISEI <sup>a</sup> Parents' highest	0.031***	0.019*	0.004	-0.020**	-0.017*	-0.028**
ISCED (Ref.: ISCED 0-2)						
ISCED 3-4	0.036	0.007	0.002	0.016	-0.058	0.033
ISCED 5-6	0.088***	0.031*	-0.001	0.012	-0.053	0.047
Prior achievement						
GPA in Grade 9 or 10 <sup>a</sup>	0.054***	0.023***	-0.026***	-0.031***	/	/
GPA in Grade 12 or 13 <sup>a</sup>	/	/	/	/	-0.078***	0.025***
Competence score in Maths <sup>a</sup>	0.127***	0.054***	-0.015**	-0.002	0.021* <sup>b</sup>	-0.023** <sup>b</sup>
Competence score in Reading <sup>a</sup>	0.041***	0.034***	0.001	-0.032***	0.000 <sup>b</sup>	-0.012 <sup>b</sup>
Competence score in ICT-literacy <sup>b</sup>	0.043***	0.020***	0.001	-0.008	0.007 <sup>b</sup>	0.002 <sup>b</sup>
Educational and occ	upational aspira	tions				
Occupational aspirations (ISEI) <sup>a</sup> Educational aspiration (Ref.:	0.041***	0.033***	0.010**	-0.031***	0.021* <sup>b</sup>	-0.001 <sup>b</sup>
Something different	0.148***	0.061***	0.017	-0.089***	0.217*** <sup>b</sup>	-0.337*** <sup>b</sup>
School	0.104***	0.089***	0.017**	-0.103***		
University	/	/	/	/	0.317*** <sup>b</sup>	-0.342*** <sup>b</sup>

## **Supplementary Table 4.** Full version of the regression models.

	ER1: Enrollment in Grade 9	ER2: Enrollment after lower-secondary education		ER1:ER2:ER3: EnrollmenEnrollmentEnrollment after lower-secondaryupper-secondin Grade 9educationeducation		ment after condary tion <sup>4</sup>
	Academic track	Academic track <sup>1</sup>	Upper- secondary vocational school <sup>2</sup>	VET <sup>3</sup>	Higher education	VET <sup>3</sup>
Parents' educational aspirations as perceived by students (Ref.: no opinion)	0.107	0.076	0.021	0.040	,	,
training	-0.107	-0.070	-0.021	0.040	/	/
VET	-0.141***	-0.057***	-0.029**	0.058***	-0.052 <sup>b</sup>	0.001 <sup>b</sup>
University	0.076***	0.027*	-0.007	-0.048**	0.060*** <sup>b</sup>	-0.022 <sup>b</sup>
Pseudo-R <sup>2</sup>	0.517 (ER1)		0.388 (ER2)		0.160 (	ER3)

#### Supplementary Table 4 (continued)

*Notes.* <sup>a</sup> *z*-standardised. <sup>b</sup> Measured in Grade 11 or 12. <sup>1</sup> Attending upper-secondary school of the general school system until Grade 12 or 13. <sup>2</sup> Attending full-time vocational schools at upper-secondary level (e.g., *Fachoberschule, Berufliches Gymnasium*, etc.). <sup>3</sup> Entering company- or school-based vocational education and training (VET). <sup>4</sup> Includes only respondents who achieved an upper-secondary degree in an academic track. KHB corrected estimates. Robust standard errors on school level. Level of significance: \*\*\* *p* < 0.001; \*\* *p* < 0.01; \* *p* < 0.05. Imputed data (*m* = 25).

**Supplementary Table 5.** Robustness checks on the mediation of the effect of immigrant background on enrollment rates.

	<b>ER1:</b>		<b>ER2:</b>	ER3:		
	Enrollment	Enrollment after lower- secondary education			Enrollm	ent after
	in Grade 9				upper-se	condary
	Academic track	Academic track <sup>1</sup>	Upper- secondary vocational school <sup>2</sup>	VET <sup>3</sup>	Higher education	VET <sup>3</sup>
Final mediation r	model (Table 1)					
AME in	.059***	.039***	.036***	082***	.076***	052***
baseline model						
AME in	.000	.012	.029***	050***	.049**	037**
mediation model						
(+ Aspirations)	100.00/	<u> </u>	10 40/	20.00/	25.50	<b>2</b> 0.00/
Mediation in %	100.0%	69.2%	19.4%	39.0%	35.5%	28.8%
Robustness check	x 1a: Added HOM	IEPOS scale a	is an addition	al indicator f	tor social backs	ground
AME in	.059***	.040***	.036***	083***	.07/***	052***
baseline model	000	012	020***	050***	040**	027**
AME in modiation model	.000	.013	.029***	050***	.049**	03/**
$(\perp A spirations)$						
Mediation in %	100.0%	67.5%	19.4%	39.8%	36.4%	
Reduction III 70	<b>100.070</b>	ropte' HISEI u	with percente'	ECD alass	50.470	20.070
AME in	10. Replaced pa	037***		070***	075***	0/0***
baseline model	.057	.037	.050	077	.075	047
AME in	- 001	008	029***	- 046***	048**	- 034**
mediation model	1001	1000	.022	.010	1010	.001
(+ Aspirations)						
Mediation in %	101.7%	78.4%	19.4%	41.8%	36.0%	30.6%
Robustness check	<b>A 1c:</b> Replaced part	rents' ISCED	with parents'	CASMIN		
AME in	.045***	.034***	.038***	079***	.067***	060***
baseline model						
AME in	010	.007	.031***	047***	.050**	046***
mediation model						
(+ Aspirations)						
Mediation in %	122.2%	79.4%	18.4%	40.5%	34.2%	23.3%
Robustness check	<b>x 2:</b> Added measu	res for anticip	ated discrimi	nation and ir	nformation defi	icits as
additional control	variables					
AME in	.054***	.038***	.036***	079***	.074***	051***
baseline model	000	010	000++++	01	0404-5	00744
AME in model	002	.010	.029***	046***	.048**	03/**
(LA spirations)						
(+ Aspirations) Mediation in %	103 7%	73 70/-	10 /10/-	/1 80/-	35 104	27 50/
	103.7%	13.1%	19.4%	41.070	33.1%	21.3%

#### Supplementary Table 5 (continued)

	ER1: Enrollment in Grade 9	ER2: Enrollment after lower- secondary education			ER Enrollm upper-se educa	23: ent after condary tion <sup>4</sup>
	Academic track	Academic track <sup>1</sup>	Upper- secondary vocational school <sup>2</sup>	VET <sup>3</sup>	Higher education	VET <sup>3</sup>
<b>Robustness check</b>	<b>3:</b> Expanded imm	nigrant backgro	und up to the	third genera	ation	
AME in	.058***	.040***	.034***	-	.078***	051***
baseline model				.081***		
AME in	001	.012	.027***	-	.050**	036**
mediation model				.048***		
(+ Aspirations)						
Mediation in %	101.7% 5	70.0%	20.6%	40.7%	35.9%	29.4%

*Notes.* <sup>1</sup> Attending upper-secondary school of the general school system until Grade 12 or 13. <sup>2</sup> Attending fulltime vocational schools at upper-secondary level (e.g., *Fachoberschule, Berufliches Gymnasium*, etc.). <sup>3</sup> Entering company- or school-based vocational education and training (VET). <sup>4</sup> Includes only respondents who achieved an upper-secondary degree in an academic track. <sup>5</sup> The sum of the proportion mediated can exceed 100% (Vanderweele, 2015, pp. 121–22) when in the baseline model the AME is > 0 and in the full model the AME is < 0. Average estimates pooled over 25 imputed data sets. The mediation model estimates the mediation of educational and occupational aspirations on the ethnic choice effects to examine the immigrant optimism hypothesis. Reference category for all significance tests are respondents without

#### (A) Parents' educational expectation (=university) in Grade 9 by immigrant background and parents' ISCED



#### (C) Students' desired occupation in Grade 9 by immigrant background and parents' ISCED

#### (**B**) Parents' educational expectation (=university) in Grade 9 by immigrant background and parents' highest ISEI



(**D**) Students' desired occupation in Grade 9 by immigrant background and parents' highest ISEI



**Supplementary Figure 1.** Predictive Margins of educational and occupational aspirations by immigrant background and social background (2-way interactions). *Notes*. Robust standard errors on school level. Significant differences (p < 0.05) unless otherwise indicated. Estimates adjusted for gender, school track in Grade 9, federal state of residency, school grades, competence score in Maths, Reading, and ICT-Literacy, highest parental socio-economic status, and educational level. Imputed data (m = 25).



2nd generation (no controls)

2nd generation (+ achievement and social background)

1st generation (no controls)

■ 1st generation (+ achievement and social background)

**Supplementary Figure 2.** Effect of generational status on enrollment rates in lower-secondary education (ER1), after lower-secondary education (ER2) and after upper-secondary education (ER3). *Notes.* <sup>1</sup> Attending upper-secondary education of the general education system until Grade 12 or 13. <sup>2</sup> Attending full-time vocational schools at upper-secondary level (e.g., *Fachoberschule, Berufliches Gymnasium*, etc.). <sup>3</sup> Entering company- or school-based vocational education and training (VET). <sup>4</sup> Includes only respondents who achieved an upper-secondary degree in an academic track. *Notes.* Baseline model adjusted for gender, school track in Grade 9 (not used for ER1), federal state of residency, school grades, competence score in Maths, Reading, and ICT-Literacy, highest parental socio-economic status, and educational level. KHB corrected estimates. Reference category for all significance tests are German natives. Robust standard errors on school level. Level of significance: \*\*\* *p* < 0.001; \*\* *p* < 0.005. Imputed data (*m* = 25).

#### Supplementary Material



**Supplementary Figure 3.** Descriptive findings on students' enrollment rates in lower-secondary education (ER1), after lower-secondary education (ER2) and after upper-secondary education (ER3) by students' ethnic origin. *Notes.* <sup>1</sup> Attending upper-secondary education of the general education system until Grade 12 or 13. <sup>2</sup> Attending full-time vocational schools at upper-secondary level (e.g., *Fachoberschule, Berufliches Gymnasium*, etc.). <sup>3</sup> Entering company- or school-based vocational education and training (VET). <sup>4</sup> Includes only respondents who achieved an upper-secondary degree in an academic track. *Notes.* Imputed data (*m* = 25).



No controls (bivariate model) Controlling for achievement and social background (basline model)

Supplementary Figure 4. Effect of ethnic origin on enrollment rates in lower-secondary education (ER1), after lower-secondary education (ER2) and after upper-secondary education (ER3). Notes. <sup>1</sup> Attending uppersecondary education of the general education system until Grade 12 or 13.<sup>2</sup> Attending full-time vocational schools at upper-secondary level (e.g., Fachoberschule, Berufliches Gymnasium, etc.). <sup>3</sup>Entering company- or school-based vocational education and training (VET). <sup>4</sup> Includes only respondents who achieved an uppersecondary degree in an academic track. Notes. Baseline model adjusted for gender, school track in Grade 9 (not used for ER1), federal state of residency, school grades, competence score in Maths, Reading, and ICT-Literacy, highest parental socio-economic status, and educational level. KHB corrected estimates. Reference category for all significance tests are German natives. Robust standard errors on school level. Imputed data (m = 25).