# ALMALAUREA

## International migration of italian graduates

Naples, 27th april 2016

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### 1. HUMAN CAPITAL AND GRADUATES WORKING ABROAD

Literature suggestions

#### **Human Capital**



Human Capital (HC) University of Chicago (Schultz, 1961; Becker, 1962, 1964; Mincer, 1958, 1974):

"rational choice" similar to that pertaining to investment in physical capital, the difference being the effect of education embodied in characteristics of each individual

Retrospective: cost of "producing" a human being (Engel,1883; Kendrick, 1976; Eisner, 1985)

Prospective: value of an individual's expected income (Petty, 1690; Farr, 1853; Jorgenson and Fraumeni (1989, 1992)

Educational attainment: years and quality of education (World Bank, 1995; United Nations, 2002; Wößmann, 2003)

OECD definition: taking into account both investment in education and returns not only in terms of income but also by satisfaction and acquired skills (OECD 1998; Dagum and Slottje 2000)



#### The University-to-job market Transition

#### Connected to HC:

#### The University-to-job market Transition

University attendance, increases the individual "quantity" of HC, allowing graduates to raise their individual productive potential and to increase their wages during their working life and particularly in the first years after the degree (Kane and Rouse, 1995; Katz and Murphy, 1992; Murphy and Welch, 1992; Juhn et al.,1993; Lovaglio and Mezzanzanica, 2011)



#### HC: graduates who work in Italy and abroad

Italian graduates in the first <u>five years</u> after the degree who work in Italy and work abroad in order to compare the evaluation of HC in Italy and abroad

Hypothesis: Do it Pay to Work Abroad?

#### Estimation methods:

Prospective (without actuarial values because of the considered years are immediately after the degree) with OECD suggestion respect to non-monetary returns







#### 2. DATA SET

AlmaLaurea ad hoc survey



#### Survey characteristics: ad hoc research

Graduates of the cohort 2008 interviewed at 5 years after graduation, <u>employed abroad</u>

Second-level graduates

Italian citizen only



Data collection method: CAWI (Computer-Assisted Web Interview)

Response rate of 51% (777 interviewed)



Data representative: rescaling with gender, disciplinary area and geographical area of the university



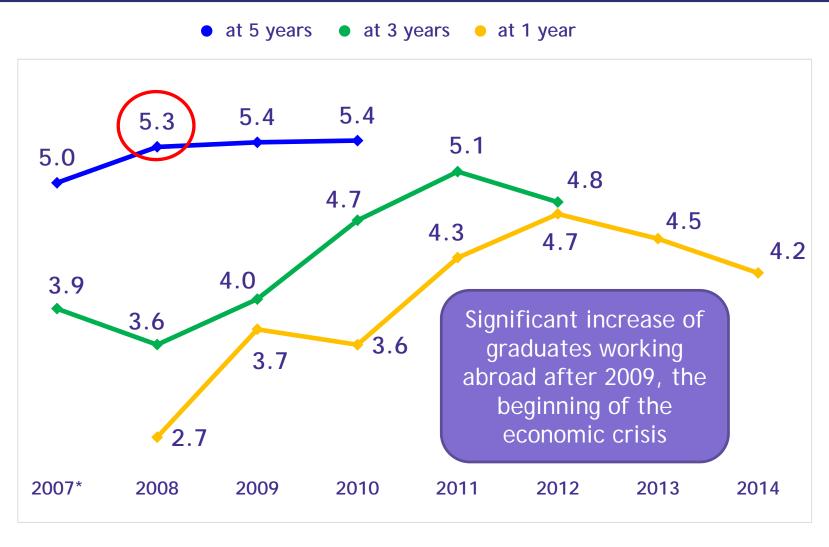


#### Italian graduates employed abroad by year of graduation

SECOND LEVEL

Italian citizen only

\*1 year data not available



Year of graduation

percentage value



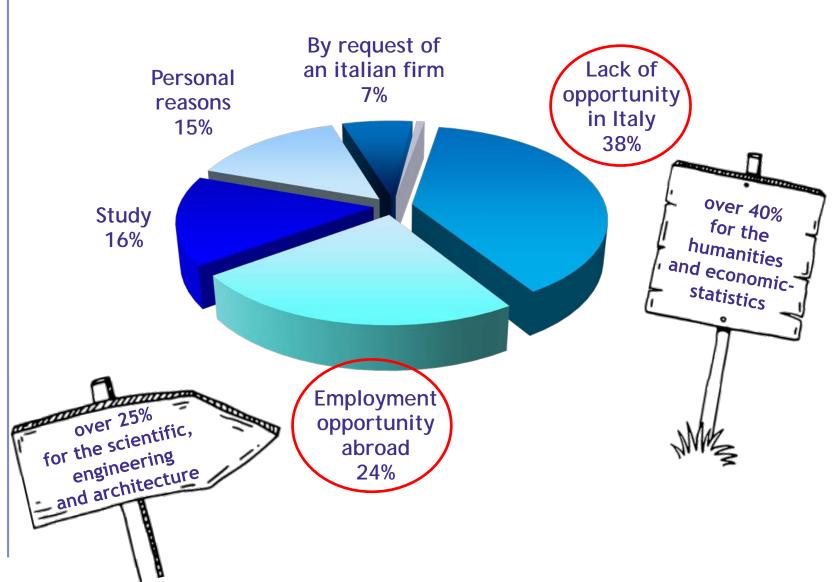
#### 3. DESCRIPTIVE STATISTICS



### Key drivers for transfer abroad at <u>5 years</u> on from graduation

SECOND LEVEL 2008

No answer not reported

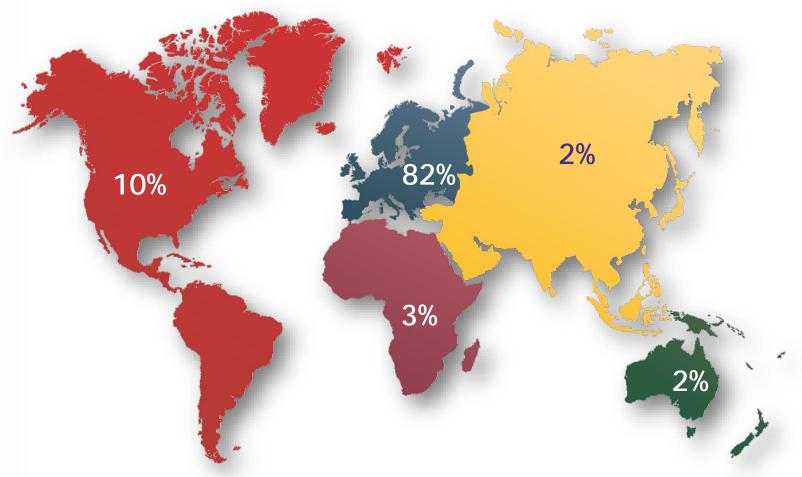




### Foreign country of destination of italian graduates at 5 years on from graduation

SECOND LEVEL 2008

Italian citizen only



The EU: the most significant area of relocation (82%, mainly the UK, France and Germany), 10% transfering to America

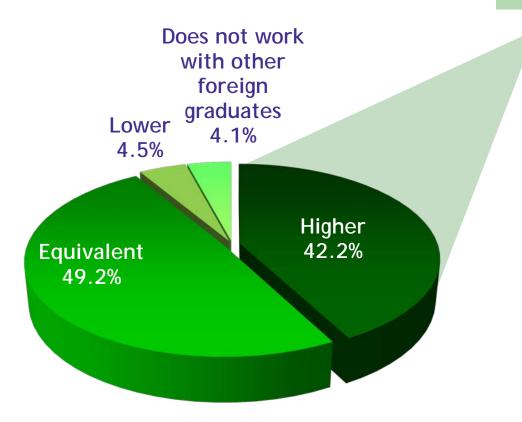


### Education qualification compared with foreigners at <u>5 years</u> on from graduation

SECOND LEVEL 2008

Italian citizen only

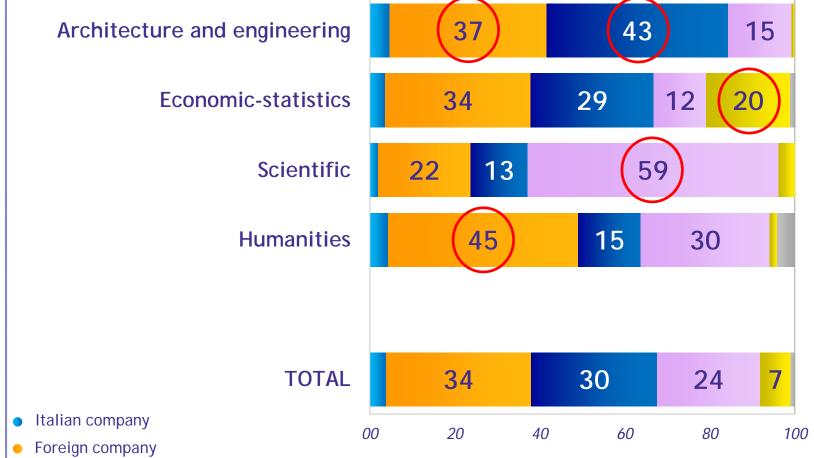
Has taken part to at least one postgraduated training activity 74%





#### Type of company at 5 years on from graduation by degree subject grouping





- Multinational company
- University or research center
- International organization
- No answer

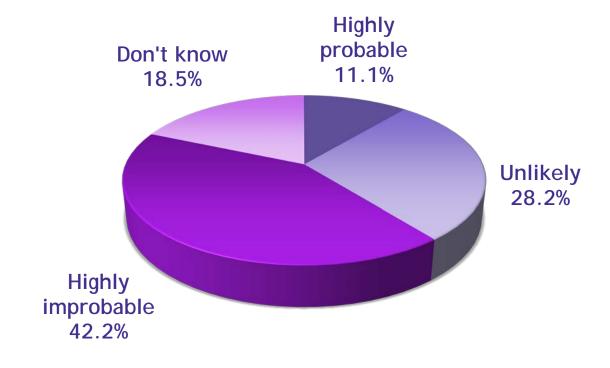


#### Futur plans to return in Italy at 5 years on from graduation

SECOND LEVEL 2008

Italian citizen only

Do you plan to return and seek employment in Italy in the next 5 years?



More than 70% of respondents are unlikely to return in Italy

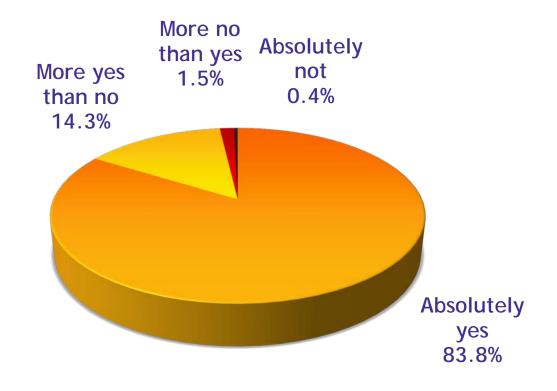


### On the choice to transfer abroad at 5 years on from graduation

SECOND LEVEL 2008

Italian citizen only

In retrospect, would you repeat the choice of transfering abroad?



Less than 2% regret their decision and over 80% declare being very satisfied



#### Descriptive statistics suggestion

SECOND LEVEL 2008

#### Italian graduates working abroad:

No significant knowledge gaps or related difficulties Employed in foreign companies, universities and research centers Emigration to the developed countries of the EU or in America Very motivated and preparated to work abroad

#### Suggestion:

HC background provided by Italian universities is not inferior to that of foreign universities

#### Hypothesis:

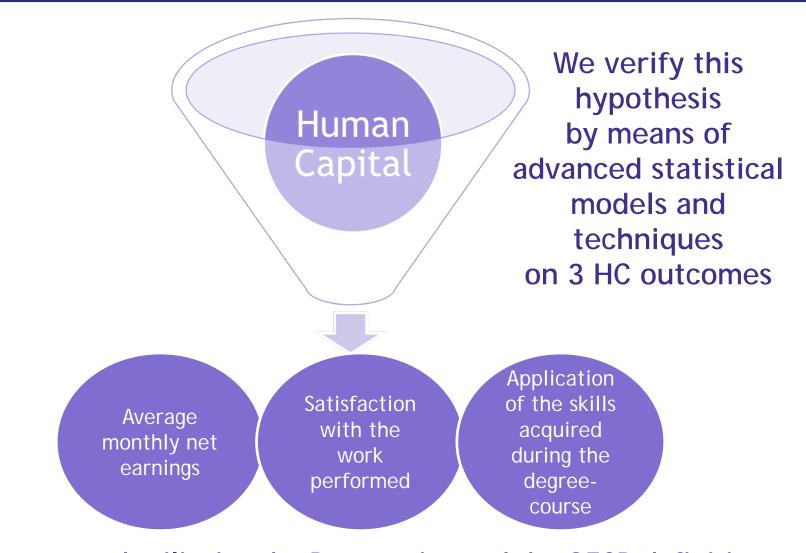
Is the Italian labor market unable to recognize and valorize the value of Human Capital generated by Italian universities?



#### 4. STATISTICAL MODELING



#### Human capital and the outcome variables



measured utilizying the Prospective and the OECD definitions

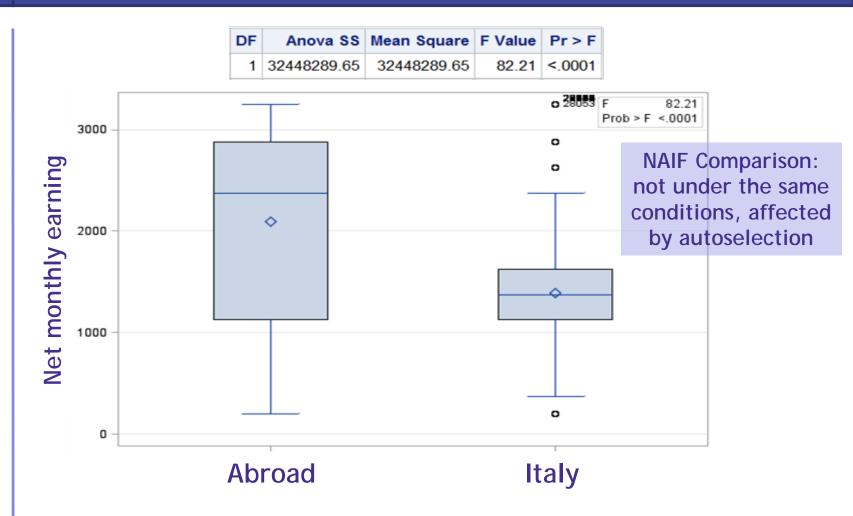


#### Net monthly earnings of graduates in Italy and abroad

SECOND LEVEL 2008

Box plot on net monthly earnings

Italian citizen only



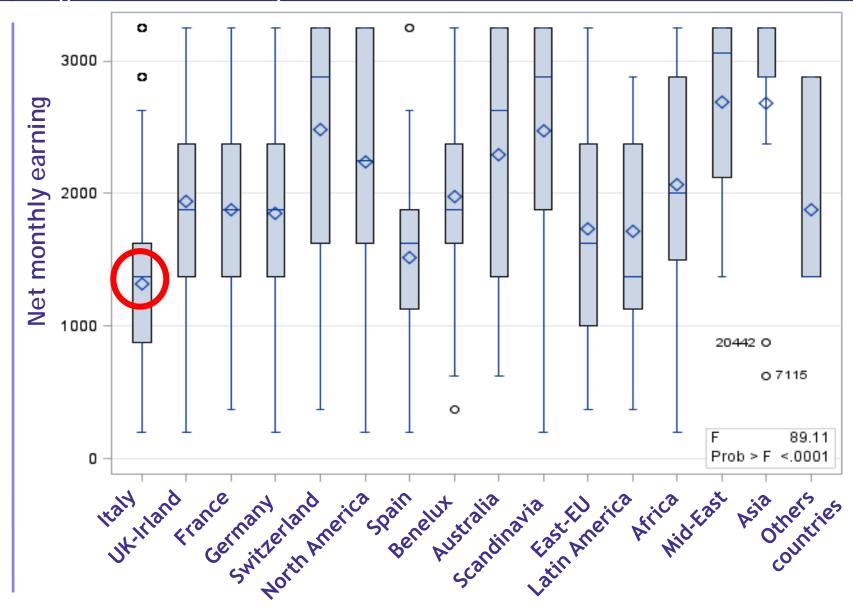
**Abroad**: the average value and the standard deviation is much larger (859.8 against 536.2 euro). The Italian labor market tends to flatten the graduates' salary not valorizing their HC.



### Net monthly earnings in <u>nominal terms</u> of graduates in Italy and abroad

SECOND LEVEL 2008

Box plot on net monthly earnings



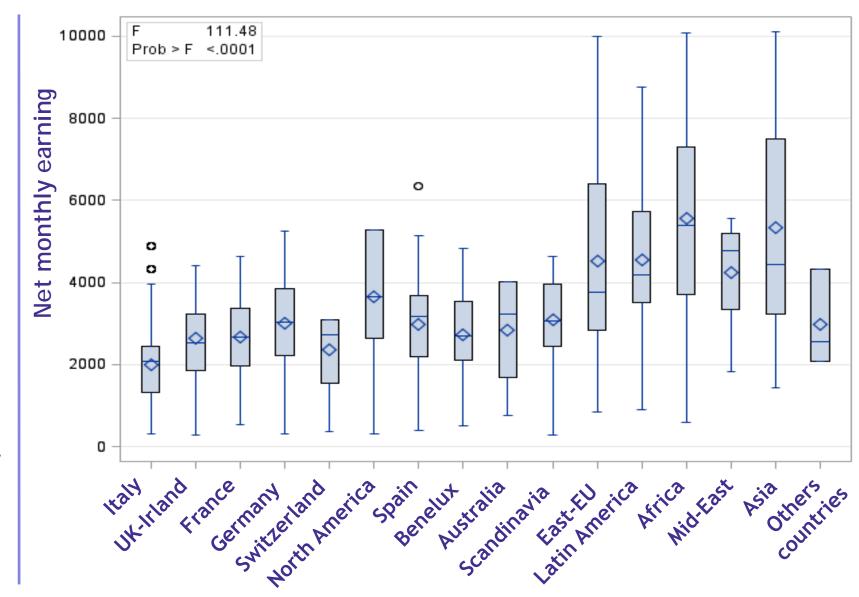


### Net monthly earnings in <u>real terms</u>\* of graduates in Italy and abroad

SECOND LEVEL 2008

Box plot on net monthly earnings in real terms

\*Numbeo cost of living indices (OECD data), declared earnings of respondents were evaluated in REAL terms, with 100=New York



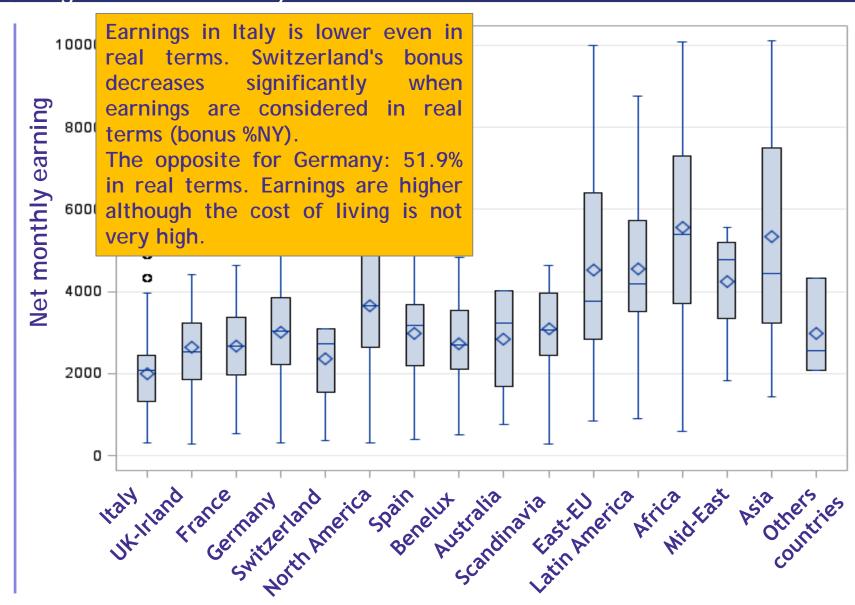


### Net monthly earnings in <u>real terms</u>\* of graduates in Italy and abroad

SECOND LEVEL 2008

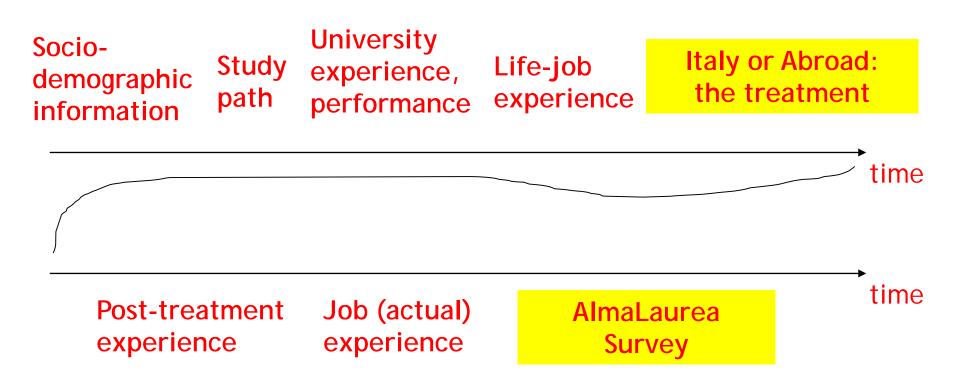
Box plot on net monthly earnings in real terms

\*Numbeo cost of living indices (OECD data), declared earnings of respondents were evaluated in REAL terms, with 100=New York





### 5. Analytics





#### Net monthly earnings - Selection bias cleaning

SECOND LEVEL 2008

Global balancing test based on multiple correspondence analysis on 91 categorical variables, hierarchical clustering and GI testing

Italian citizen only

	Equivalent	N_treated	N_untreated	interval for lb (alpha=0.01)	lb	balanced		
	Group 1	379	4836	(0;0.11)	0.9000	у		
	Group 2	235	6944	(0;0.36)	0.2200	у		
	Group 3	112	984	(0;0.03)	0.0010	у		
	Group 4	6	413	(0;0.17)	0.1900	n		
	Group 5	29	2052	(0;0.08)	0.0030	у		
^	Group 6	68	2499	(0;0.10)	0.0800	у		
е	Group 7	19	784	(0;0.11)	0.1000	у		
	Group 8	90	3426	(0;0.13)	0.6000	у		
	Group 9	238	1131	(0;0.06)	0.0700	n/y		
	Group 10	298	1679	(0;0.07)	0.0900	n/y		
	Group 11	67	2409	(0;0.008)	0.0000	у		

Treatment: working abroad

Groups are equivalent: the differences between treated and not treated in groups are «only» due to treatment



#### Net monthly earnings - Equivalent groups

equivalent groups	delta_income	adj_tValue	p-value	N_treated	Mean_treated	N_untreated	Mean_untreated	delta%
group1	768.7	19.34	0.000000	379	2154.8	4836	1386.1	55.5
group2	04U.4	11.82	0.000000	235	1974.2	6944	1333.8	48.0
group3	938.0	4.26	0.001325	112	2292.1	984	1354.1	69.3
group4	502.8	2.02	0.097828	6	1708.8	413	1206.0	41.7
group5	614.6	3.39	0.002094	29	1728.9	2052	1114.3	55.2
group6	746.2	6.85	0.000000	68	1958.1	2499	1211.9	61.6
group7	000.5	3.45	0.002774	19	1836.0	784	1196.5	53.4
group8	584.5	6.66	0.000000	90	1759.9	3426	1175.4	49.7
group9	790.2	13.88	0.000000	238	2186.1	1131	1389.9	57.3
group10	715.8	14.37	0.000000	298	2069.2	1679	1353.4	52.9
group11	705.5	6.44	0.000000	67	2096.7	2409	1391.1	50.7
ATE	721.4			1541			ATE in %	54.8
average treatement effect	ot							

Group 3 with the highest effect: 938 euro a month Group 8 with the lowest effect: 584.5 euro a month

Only group 4 non significant t-test: only 6 not balanced treated



### Net monthly earnings in real terms - Comparison with monetary values by equivalent groups

SECOND LEVEL 2008

Italian citizen only

equivalent groups	delta_income	delta%	delta_income (real)	delta% (real)
group1	768.7	55.5	1106.1	52.9
group2	640.4	48.0	974.3	48.5
group3	938.0	69.3	1501.6	73.6
group4	502.8	41.7	1457.7	80.2
group5	614.6	55.2	794.6	47.3
group6	746.2	61.6	988.7	54.1
group7	639.5	53.4	985.3	54.6
group8	584.5	49.7	854.9	48.3
group9	796.2	57.3	1243.4	59.4
group10	715.8	52.9	1098.7	53.9
group11	705.5	50.7	1143.3	54.5
ATE	721.4	54.8	1083.5	58.6

In real terms, ATE% (average bonus) is therefore 58.6%, with all clusters registering as positive. Conclusion: earnings abroad are higher than earnings in Italy



### Net monthly earnings in real terms - Modelling within heterogeneity by equivalent groups

SECOND LEVEL 2008

Regression linear model on each balanced cluster

group 4 not reported

Italian citizen only

significant p-value

not significant p-value

Variability source label	P-value_1	P-value_2	P-value_3	P-value_5	P-value_6	P-value_7	P-value_8	P-value_9	P-value_10	P-value_11
Emigration (dummy)	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
Degree efficacy in the work	0.2758	0.0000	0.0826	0.0814	0.0028	0.0065	0.1905	0.0000	0.0000	0.0000
Gender	0.0000	0.0000	0.0004	0.0000	0.0000	0.0003	0.0000	0.0000	0.0000	0.0000
Degree subject grouping	0.0000	0.0000	0.0045	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
Geographic area of univ.	0.9208	0.1197	0.0358	0.0068	0.4556	0.8869	0.0729	0.4391	0.0007	0.0296
Regularity index in studies	0.2268	0.3233	0.9049	0.6760	0.0032	0.0866	0.4127	0.2131	0.2069	0.0066
Final grade to high school	0.0939	0.7138	0.3349	0.9799	0.1853	0.2645	0.0734	0.0540	0.1086	0.0144
Final grade to university	0.0614	0.5745	0.2030	0.2877	0.5248	0.1614	0.0532	0.4843	0.0004	0.0000
Geographic residence	0.2014	0.4270	0.0506	0.1601	0.5488	0.1938	0.3117	0.3925	0.1114	0.0001
Latest work of the mother	0.4523	0.0186	0.0076	0.4970	0.7507	0.4140	0.3910	0.0556	0.3225	0.2835
Latest work of the father	0.5473	0.0000	0.9022	0.8900	0.0017	0.3025	0.1008	0.2582	0.7785	0.2121
Mother study degree	0.8406	0.9002	0.6228	0.2783	0.5862	0.2098	0.3304	0.1135	0.1606	0.3959
Father study degree	0.2916	0.2184	0.2402	0.0570	0.0081	0.4031	0.0038	0.2201	0.1885	0.6949
R-square	0.320	0.350	0.310	0.340	0.290	0.300	0.350	0.310	0.340	0.330
Anova F-test p-value	For all grou	ıps, p-value	< 0.00							



### Net monthly earnings in real terms - Modelling within heterogeneity by equivalent groups

SECOND LEVEL 2008

Regression linear model on each balanced cluster

group 4 not reported

Italian citizen only

positive impact valuenegative impact value

		Test- value Group 9	Test- value Group 8	Test- value Group 7	Test- value Group 6	Test- value Group 3	Test- value Group 1	Test- value Group 5	Test- value Group 10	value	Test- value Group 11
Migration	Emigrant	17.13	5.25	5.95	11.57	5.21	6.99	5.67	20.28	16.58	10.37
Migr	No emigrant	-17.13	-5.25	-5.95	-11.57	-5.21	-6.99	-5.67	-20.28	-16.58	-10.37
der	Male	5.94	4.61	3.59	9.64	3.53	5.09	6.73	6.25	11.30	12.94
Gender	Female	-5.94	-4.61	-3.59	-9.64	-3.53	-5.09	-6.73	-6.25	-11.30	-12.94
	Agricolture, veterinary	-0.74	-0.24	-0.86	-1.41	-0.79	-0.79	-1.75	-1.95	1.35	-1.15
	Architecture	-5.52	-2.47	-0.31	-6.36	-1.02	-0.99	-0.51	-2.43	-3.99	-4.16
	Chemistry-pharmacy	0.61	1.47	2.19	3.12	1.60	0.34	3.85	3.32	2.42	-0.15
Ē	Economic-statistic	6.53	3.89	2.26	1.84	1.86	2.54	-0.05	5.82	9.28	10.44
subject grouping	Geo-Biology	0.09	-0.59	-1.11	-0.98	-0.09	0.78	-1.37	-0.51	-2.05	-2.14
gu	Law	2.83	1.06	-2.03	-3.54	0.12	-1.01	-0.24	-0.22	-6.26	-5.28
ect	Engineering	8.24	7.49	4.41	9.06	0.07	3.53	3.72	11.50	13.83	3.69
įđ	Education	-0.93	-1.27	0.56	0.10	-1.03	-0.93	1.28	-0.90	-3.50	-0.78
e S	Humanities	-5.36	-7.06	-1.92	-2.92	-0.50	-4.10	-2.20	-5.94	-8.68	-2.19
Degree	Foreign languages	-3.24	-0.84	-2.52	-0.74	-0.70	-1.09	-1.52	-3.29	-2.80	-2.82
De	Medicine	3.30	1.43	2.95	9.40	3.26	2.94	5.60	4.47	10.17	10.45
	Politic and social sciences	0.06		1.14	-0.54	0.96	-0.86	-1.29		1.15	
	Psicology	-1.41	-7.39		-6.89	0.16	-1.59	-4.44	-5.20	-8.30	-3.10
	Scientific	-0.48	1.52	-0.26	1.16	-1.04	-0.28	1.00	0.57	0.82	1.83



### Net monthly earnings in real terms - Modelling within heterogeneity by equivalent groups

SECOND LEVEL 2008

Regression linear model on each balanced cluster

group 4 not reported

Italian citizen only

positive impact value
 negative impact value

Test- Value Value Value Value Value Value Value Value Value Test- Test- Test- Test- Test- Test- Test- Test- Test- Value		Test- value Group 11
Emigrant 17.13 5.25 5.95 11.57 5.21 6.99 5.67  No emigrant -17.13 -5.25 -5.95 -11.57 -5.21 -6.99 -5.67	20.28 16.5	10.37
17110 5125 5170 11157 5121 5177 5167	-20.28 -16.5	-10.37
Male 5.94 4.61 3.59 9.64 3.53 5.09 6.73  Female -5.94 -4.61 -3.59 -9.64 -3.53 -5.09 -6.73	6.25 11.3	12.94
Female -5.94 -4.61 -3.59 -9.64 -3.53 -5.09 -6.73	-6.25 -11.3	-12.94
Agricolture, veterinary -0.74 -0.24 -0.86 -1.41 -0.79 -0.79 -1.75	-1.95 1.3	35 -1.15
Architecture -5.52 -2.47 -0.31 -6.36 -1.02 -0.99 -0.51	-2.43 -3.9	-4.16
Chemistry-pharmacy 0.61 1.47 2.19 3.12 1.60 0.34 3.85	3.32 2.4	-0.15
Economic-statistic 6.53 3.89 2.26 1.84 1.86 2.54 -0.05	5.82 9.2	10.44
Economic-statistic 6.53 3.89 2.26 1.84 1.86 2.54 -0.05 Geo-Biology 0.09 -0.59 -1.11 -0.98 -0.09 0.78 -1.37 Law 2.83 1.06 -2.03 -3.54 0.12 -1.01 -0.24	-0.51 -2.0	-2.14
	-0.22 -6.2	-5.28
Engineering 8.24 7.49 4.41 9.06 0.07 3.53 3.72	11.50 13.8	3.69

Female gender is **penalized** in any balanced cluster; on the other side there seems to be a **prize** for economic-statistics, engineering and medicine degrees.

There is no single model, but the stories of the people can constitute paths and different motives on the impact on net monthly earnings.



#### Textual opinions: to do for Italy (in word clouds)

capacità futuro offrire fidarsi proprie prova giovani fare Consentanolimitare competenze cosafortemente conoscenze speranza negare mettere valorizzare stessa

Group 3: social class not very high, ch. teacher, maximum prize

Group 5:
expectations
professional growth,
South Ita, social
class in the middle,
not very high study
performance

forti più abolitiOK sistemare occasionaletot lentamente attualmentepotrà buonepreparata considerandola raggirare maestri considerandola possano valorizzazione possano valorizzazione pausasempre clientelare arricchisca collegamenti studenti comporti contirovescio azienda neppure



#### 6. CONCLUSION

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#### Conclusion

- □ In the last years the % of Italian graduates working abroad increased No brain drain: in the first 5 years after graduation, they are better paid than in Italy - monetary HC theory in the prospective version
- ☐ The graduate income vary among different countries but everywhere is greater than in Italy, both in monetary and either in real-value
- ☐ The variance of income is greater abroad affected by education and socio-economic status of parents, kind of university, individual characteristics as in the HC theory
- □ Different clusters. Several, also non-monetary reasons (satisfaction, consistency and stability of work, cultural) for working abroad. They do not escape from Italy. HC theory with non-monetary returns
- □ Policy implications: stimulate Italian companies to better pay Italian graduates; improve foreigner graduates to come to Italy