Appendix A

Table A1 – Input variables and source

Thematic Area	Label	Description	Source	Year
Population	Pop.2017	Total population on 1st January	Eurostat [demo_r_d2jan]	2017
	% Pop. >65	People aged 65 and over (% of total population)	elaboration on Eurostat (demo r pianaggr3)	2017
	% Pop. <15	People aged less than 15 (% of total population)	elaboration on Eurostat [demo r pianaggr3]	2017
	% foreigners	Foreign (EU and non-EU countries) population (% of total population)	elaboration on Eurostat [cens 11ctzo r2]	2011
	Pop. Density	Population density (per km2)	Eurostat [demo r d3dens]	2017
	% Pop upper secondary/	Population aged 25-64, with upper secondary and tertiary education (ISCED levels 3-8) (% of total		0017
	tertiary educ.	population)	Eurostat [edat_lise_04]	2017
Economy	per capita GDP	Gross domestic product (GDP) at current market prices in Purchasing Power Standard, per inhabitant	Eurostat [nama_10r_2gdp]	2016
and labour	Unempl. Rate	Unemployment rate (15-74 years)	Eurostat [lfst_r_lfu3rt]	2017
market	Empl. Rate	Employment rate (15-64 years)	Eurostat [lfst r lfe2emprt]	2017
Sectoral	% GVA A	Gross value added at basic prices from Agriculture, forestry and fishing (A) (% of total GVA)	elaboration on Eurostat [nama_10r_3gva]	2015
structure	% Empl B-E	Employment in Industry (except const.) (B-E) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl F	Employment in Construction (F) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl G-I	Employment in Wholesale and retail trade, transport etc. (B-I) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl J	Employment in Information and communication (J) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl K	Employment in Financial and insurance activities (K) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl L	Employment in Real estate activities (L) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl M-N	Employment in Professional, scientific and technical activities (M-N) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl O-Q	Employment in Public administration (O-Q) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Empl R-U	Employment in Arts, entertainment and recreation (R-U) (% of total employment)	elaboration on Eurostat [nama_10r_3empers]	2015
	% Mining, quarrying (05-09)	Employment in Mining and quarrying (05-09) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Food, drinks & tobacco 10 12	Employment in Food, drinks and tobacco (10-12) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Textiles, apparel & leather (13-15)	Employment in Textiles, apparel and leather (13-15) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Wood, paper & printing (16-18)	Employment in Wood, paper and printing (16-18) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Chem., pharm., rubber, plastic & refined petrol. (19-22)	Employment in Chemicals, pharmaceuticals, rubber, plastic and refined petroleum (19-22) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Non-metallic mineral products (23)	Employment in Non-metallic mineral products (23) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs r nuts06 r2]	2015*
	% Basic metals & metal products (24-25)	Employment in Basic metals and metal products (24-25) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Electric, electronic, computer & optical equipment (26-27)	Employment in Electric, electronic, computer and optical equipment (26-27) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Machinery (28)	Employment in Machinery (28) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs r nuts06 r2]	2015*
	% Transport equipment (29-30)	Employment in Transport equipment (29-30) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	% Other manufacturing (31-33)	Employment in Other manufacturing (31-33) (% of employment in B + C)	elaboration on Eurostat SBS data [sbs_r_nuts06_r2]	2015*
	Tourists per inhabitant	Arrivals at tourist accommodation establishments per inhabitant	elaboration on Eurostat [tour_occ_arn2]	avg. 2011- 2017**

* Due to the presence of missing values in the structural business statistics (SBS) section, the values for year 2015 can be replaced with the values from the closest available year (2008-2015). However, for some regions and some NACE Rev.2 divisions, no data are available for the whole period under consideration. In these cases, a value equal to 0 is assigned to the specific region/division.

** The average is computed on the only available data

Source: authors' elaboration on Eurostat data

Table A2 – Clusters of regions

	~	Population			Population Economy labour market							Sectoral structure												_							
	Label	Pop.2017 (mill.)	% Pop. >65	% Pop. <15	% foreigners	Pop. Density	% Pop upper sduc.	per capita GDP (000€) Unempl. Rate	Empl. Rate	% GVA A	% Empl B-E	% Empl F	% Empl G-l	% Empl J	% Empl K	% Empl L	% Empl M-N	% Empl O-Q	% Empl R-U	% Mining, quarrying (05-09)	% Food, drinks & tobacco (10 12 % Tovtiloe	apparel, (13-	% Wood, paper, (16-18)	% Chem., Pharm (19-22)	% Non-metallic mineral (23)	% Basic metals (24-25)	% Electric, … (26-27)	% Machinery (28) % Transport	equip. (29-30) % Other manuf.	(31-33) Touriets linbabit	I OULISTS/IIIIIADIL
	Very-high income capital city-regions Very-high income; financial centres; foreigners Very-high income; capital city-regions; diversified services	0.6 5.0	14.2 12.3	16.2 19.6	42.7 26.9	225 6508	76.4 79.2	75.1 5.9 56.6 10.	66.3 164.8	0.3 0.0	8.9 3.7	10.2 4.0	23.3 17.1	4.1 7.3	11.0 11.0	0.9 8.6	15.6 2 19.0 2	20.7 24.2	4.3 5.1	1.3 1.5	26.0 (19.9 (0.0 5.8	6.5 12.2	5.9 13.5	11.2 1.8	20.8 8.1	2.5 5.3	19.3 0 7.1 10	0 6 .0 13	.6 2. 3.7 2.	.0 .3
suo	Very-high income; high-density city-regions; high-employm.; highly educated Very-high income; high-density city-regions; high-employm.; highly educated to unistic	3.1 1.8	16.5 18.8	16.7 14.1	5.3 13.5	519 3152	87.5 86.8	42.4 5.4 47.2 5.9	73.0 72.9	0.8 0.1	10.6 9.4	5.9 4.7	26.0 26.0	5.6 5.3	4.0 3.6	1.4 2.5	15.6 2 17.6 2	23.1 23.9	5.0 7.0	1.7 0.4	16.8 ±	5.2 2.0	8.1 7.3	16.2 12.0	3.7 2.0	10.8 12.4	11.0 16.0	6.7 7 12.6 8	6 12 4 19	2.2 1. €.1 3	.9 .4
J regi	Urban regions; high-income; poorer employm. conditions; touristic	3.7	19.2	16.2	10.3	523	70.4	28.4 11.	5 63.8	1.1	9.3	5.9	28.0	3.5	3.1	0.9	13.5	25.0	8.3	1.2	25.3 4	1.2	9.8	13.5	5.0	10.9	5.9	3.9 4	6 15	5.6 2.	.4
ш	Very-high income; manuf.; population imbalances Medium-high income regions, services & public sector	5.7	22.5	13.4	9.1	260	72.7	34.9 6.8	69.3	1.5	20.4	5.7	24.4	2.4	2.8	0.8	12.2	20.6	8.6	0.5	10.5 4	4.1	5.7	10.6	3.4	18.6	9.4	15.4 12	.5 9	.4 1.	.9
-Weste	High-income; high-employm.; low-manuf.; services & public sector Medium-income; employm. imbalances; low-manuf.; services & public sector	2.4 2.3	20.7 20.7	15.5 17.6	4.0 3.8	249 111	82.5 77.3	30.4 5.4 24.9 9.1	73.7 64.6	1.9 3.3	13.7 13.2	6.4 6.8	23.6 21.3	2.2 1.5	1.9 2.2	1.0 1.0	14.7 : 12.1 :	28.7 32.7	5.0 5.2	1.5 0.7	17.5 2 23.4 3	2.1 3.6	7.7 8.4	13.2 14.7	4.2 3.6	14.8 16.6	7.2 5.6	12.5 9 6.9 6	2 10 1 10).0 2.).2 1	.1 .8
North	High-employment, with advanced services Medium-income; high-employm.; manuf. & private services Medium-income; high-employm.; highly educated; manuf.: mining & uarrying	5.2 3.5	19.1 19.4	17.8 15.4	7.0 3.2	323 148	78.1 87.3	26.0 4.4 27.5 4.6	73.4 71.7	0.9 1.6	17.3 21.2	6.5 7.2	19.0 19.5	4.3 2.6	4.3 3.1	13.1 4.7	9.8 2 8.6 2	20.9 26.7	3.9 3.6	1.1 19.2	15.3 2 12.2 2	2.9 2.9	9.5 9.6	12.8 7.3	3.1 2.6	16.5 15.2	8.3 5.7	7.4 12 6.6 10	.5 1(.2 8).7 1. .6 1	.3 .9
	High-income low-population density regions High-income; low-population density; tourism High-income; sparsely populated; public sector; highly educated Eastern manufacturing regions	0.9 1.0	20.0 22.9	14.7 16.3	9.0 3.8	71 25	81.7 85.6	32.1 5.9 28.6 7.9	5 71.2 5 72.5	2.2 4.3	15.6 16.0	7.7 7.5	27.8 19.2	2.0 2.1	2.3 1.2	1.3 1.2	9.3 9.1	23.1 33.7	5.3 5.0	2.0 1.5	18.2 4 9.2 2	4.5 2.3	12.6 18.0	7.5 7.3	5.5 3.5	17.0 21.5	7.5 10.4	8.5 5 12.7 5	2 1 [.] 5 8	I.6 5. .1 2.	.9 .4
tern ons	Low-income; high-employm.; manuf.; no foreigners; very highly educated	1.3	17.9	15.1	1.9	116	90.7	20.0 4.8	69.9	3.8	30.3	7.7	22.8	1.6	1.2	1.1	7.1	18.7	3.2	2.2	9.2 \$	5.2	7.5	9.5	4.8	19.2	9.9	9.2 14	.9 8	.3 0.	.9
reg	Very low-income; manuf.; no foreigners; highly educated Very low-income; agricultural; manuf.: textile, electric, transport; low- population density	2.2 1.4	17.0 20.2	15.2 14.2	0.2 0.5	97 67	86.8 79.7	16.4 5.6 12.4 6.6	65.0 63.2	4.1 8.3	22.3 24.3	7.3 5.6	22.8 20.4	1.6 0.9	1.8 0.9	0.8 0.6	5.1 4.3	19.3 18.9	3.0 2.9	2.5 4.2	16.9 1 16.5 1	1.2 6.7	10.4 5.5	9.8 8.9	4.8 3.0	12.5 12.3	5.5 8.1	4.6 7 6.5 10	5 14 .8 7	↓.2 0. .7 0.	.7 .6
an	Regions with traditional economy & empl.imbalances Medium-income; employm. & population imbalances; manuf.: textile, basic metal, transport; very poorly educated.	1.7	23.5	12.5	5.2	105	60.0	23.6 11.	9 60.9	3.3	17.9	6.9	25.6	1.4	1.9	0.6	9.7	20.3	8.9	1.7	17.1 1	4.4	7.1	7.2	5.8	16.8	3.9	4.9 11	.7 9	.4 1.	.7
errane	Low-income; high-density; high unemploym.; agriculture; tood & drinks; very poorly educated	4.2	19.4	14.6	6.3	185	52.4	19.7 20.	2 48.8	4.5	10.5	6.2	28.3	1.4	1.8	0.6	10.0	22.6	10.4	1.2	26.4 9	9.2	8.0	8.5	7.0	14.6	2.9	3.4 5	7 13	3.0 1.	.2
Medite	unemploym; traditional services (G-I) Touristic areas; traditional-economy	0.8	22.6	14.1	6.8	45	60.9	17.4 20.	9 55.3	8.4	11.6	5.8	28.2	0.9	1.4	0.3	6.1	22.5	6.0	2.6	40.2 8	3.2	7.0	7.3	6.1	14.4	2.4	2.6 1	87	.4 1.	.4
	Low-income; high-unemploym.; touristic; food & drinks; traditional services (G-I); very poorly educated	0.8	18.6	15.3	13.1	140	59.4	21.6 16.	2 60.7	3.3	5.6	6.7	42.6	0.9	1.2	0.8	8.4	18.8	6.7	1.8	42.1 4	1.9	10.0	2.8	8.4	11.9	0.9	0.9 1	0 1	5.3 8.	.2

Details on variables are described in Supplemental Table 1

Thematic Area	Label	Minimu m	1st quintile	2nd quintile	3rd quintile	4th quintile	5th quintile (max)
	Pop.2017	126,883	816,286	1,321,012	2,042,362	3,548,656	17,890,100
	% Pop. >65	11.57	17.36	19.03	20.54	22.55	28.35
Dopulatio	% Pop. <15	11.05	13.63	14.54	15.73	16.83	21.89
Populatio	% foreigners	0.06	1.25	3.40	5.80	9.41	42.73
	Pop. Density	3.4	61.9	88.9	133.7	292.7	7408.6
	% Pop upper secondary/tertiary educ.	42.0	66.3	77.4	82.8	88.4	97.6
Economy	per capita GDP	8,600	18,100	23,600	27,540	32,680	75,100
labour	Unempl. Rate	1.7	4.2	5.6	7.7	11.3	29.1
market	Empl. Rate	40.6	61.0	66.0	69.4	73.9	79.2
	% GVA A	0.0	1.0	1.7	3.1	5.1	12.3
	% Empl B-E	3.2	10.0	13.8	17.2	21.9	40.2
	% Empl F	3.1	5.6	6.4	6.9	7.5	11.7
	% Empl G-I	14.3	21.0	22.7	24.8	27.2	49.6
	% Empl J	0.4	1.1	1.5	2.1	3.1	10.1
	% Empl K	0.4	1.2	1.8	2.2	3.0	14.1
	% Empl L	0.1	0.5	0.8	1.0	1.5	16.3
	% Empl M-N	1.5	6.4	9.1	10.9	13.4	23.1
	% Empl O-Q	9.9	18.6	21.7	24.2	28.9	39.0
	% Empl R-U	1.5	3.6	4.4	5.3	7.6	15.4
	% Mining, quarrying (05-09)	0.0	0.5	0.8	1.3	2.4	22.1
Sectoral	% Food, drinks & tobacco 10 12	0.0	10.1	15.1	19.0	25.7	62.3
structure	% Textiles, apparel & leather (13-15)	0.0	1.8	2.8	4.6	8.8	44.1
	% Wood, paper & printing (16-18)	1.6	5.8	7.3	8.7	11.0	29.6
	% Chem., pharm., rubber, plastic & refined petrol. (19-22)	1.0	6.5	8.8	10.7	14.4	45.1
	% Non-metallic mineral products (23)	0.5	2.6	3.6	4.5	5.9	13.6
	% Basic metals & metal products (24- 25)	6.3	10.5	12.9	15.7	18.6	37.0
	% Electric, electronic, computer & optical equipment (26-27)	0.2	3.4	5.4	7.3	9.8	26.1
	% Machinery (28)	0.0	3.3	5.4	8.2	11.6	26.4
	% Transport equipment (29-30)	0.0	2.4	4.8	7.9	13.5	37.6
	% Other manufacturing (31-33)	4.0	7.7	9.1	11.2	13.9	26.7
	Tourists per inhabitant	0.2	0.8	1.3	1.8	2.7	12.4

Table A3 – Quantile distribution for input variables of EU-28 regions

Table A4 – Clusters, by macro-group: number of regions, population and NUTS codes

	No.of regions Por		Popula	tion							
Label	#	%	Million	%	Regions: NUTS codes						
NORTH-WESTERN EU REGIONS											
Very-high income capital city-regions											
Very-high income; financial centres; foreigners	1	0.5	0.6	0.1	LU						
Very-high income; capital city-regions; diversified	2	1.0	10.1	2.0	BE1. UKI						
services											
Very high income: large urban regions: high											
employment: highly educated	13	6.3	39.9	7.8	SE11 SIDA SKO1						
Very-high income: high-density city-regions: high-					SET1, 5104, 5101						
employment; highly educated; touristic	5	2.4	9.2	1.8	AT13, CZ01, DE3, DE5, DE6						
Urban regions; high-income; poorer employment	10	4.0	26.0	7.0	CV EL 20 ES20 ES51 EB91 EB92 JE01 JTI4 MT DT17						
conditions; touristic	10	4.0	30.9	1.2	CT, EL30, E330, E331, FR01, FR02, IE01, 1114, WIT, F117						
Very-high income manuf. regions											
Very-high income; manufacturing; population	14	6.7	79.7	15.	DE1, DE2, DE7, DEA, DEC, ES21, ES22, ES24, ITC1, ITC3, ITC4,						
imbalances				7	ITH3, ITH4, ITH5						
Medium-nign income regions, services & public											
High-income: high-employment: low-											
manufacturing: services & public sector	27	13.	65.1	12.	DK05 FR42 FR62 FR71 NI 11 NI 12 NI 13 NI 21 NI 22 NI 23						
manalastaning, servises a pasile social		0	00.1	8	NL33, NL34, NL41, NL42, SE22, SE23						
Medium-income; employment imbalances; low-	10		20.0	7.0	BE3, DK02, FR21, FR22, FR23, FR24, FR25, FR26, FR30, FR41,						
manufacturing; services & public sector	10	1.1	30.0	1.2	FR43, FR51, FR52, FR53, FR61, FR72						
High-employment, with advanced services											
Medium-income; high-employment; highly	3	1.4	10.4	2.1	PL22, SE33, UKM						
educated; manufacturing: mining & quarrying	-			40							
Medium-income; nign-employment; manufacturing	10	4.8	51.5	10.	UKC, UKD, UKE, UKF, UKG, UKH, UKJ, UKK, UKL, UKN						
High-income low-population density regions											
High-income: low-population density: tourism					AT11, AT12, AT21, AT22, AT31, AT32, AT33, AT34, EE, FR83,						
·	15	7.2	13.1	2.6	HR03, ITC2, ITH1, ITH2, LV						
High-income; sparsely populated; public sector;	8	3.8	83	16	EI10 EI10 EI10 ER63 SE12 SE21 SE31 SE32						
highly educated	0	0.0	0.5	1.0	1118, 1110, 1110, 11103, 0212, 0221, 0201, 0232						
EASTERN MANUFACTURING REGIONS											
Eastern manufacturing regions					CZ02 CZ03 CZ04 CZ05 CZ06 CZ07 CZ08 UU21 UU22 DI 22						
foreigners: very highly educated	14	6.7	18.5	3.6	CZUZ, CZU3, CZU4, CZU3, CZU0, CZU7, CZU6, HUZ1, HUZZ, PL33, SIA3, SKA2, SKA3, SKA4						
Very low-income: manufacturing: no foreigners:					BG33, HR04, LT, PL11, PL21, PL31, PL32, PL34, PL41, PL42,						
highly educated	20	9.6	44.0	8.7	PL43, PL51, PL52, PL61, PL62, PL63, RO11, RO12, RO21, RO22						
Very low-income; agricultural; manufacturing:	11	5.2	15.6	2.1	BG31, BG32, BG34, BG42, HU23, HU31, HU32, HU33, RO31,						
textile, electric, transport; low-population density		5.5	15.0	3.1	RO41, RO42						
MEDITERRANEAN TRADITIONAL-ECONOMY											
REGIONS											
egions with traditional economy &											
Medium-income: employment & population											
imbalances: manufacturing: textile, basic metal.	12	5.8	21.0	4.1	ES11, ES12, ES13, ES41, ITF1, ITF2, ITF5, ITI1, ITI2, ITI3, PT11,						
transport; very poorly educated					PT16						
Low-income; high-density; high unemployment;	0	2.0	22.4	6.6							
agriculture; food & drinks; very poorly educated	0	3.0	33.4	0.0	2352, 2301, 2302, 1173, 1174, 1170, 1131, 1132						
Very-low income; agriculture; sparsely populated;	13	6.3	10.0	2.0	EL41, EL51, EL52, EL53, EL54, EL61, EL63, EL64, EL65, ES23,						
very high unemployment; traditional services (G-I)		0.0		2.0	ES42, ES43, PT18						
I ouristic areas; traditional-economy											
drinks: traditional services (G-I); very poorly	6	29	49	1.0	EL42 EL43 EL62 ES53 ES70 PT15						
educated	U	2.3	4.5	1.0	2272, 2270, 2202, 2000, 2010, 1 110						
Saucated	208	100	508.6	100							





distanza hclust (*, "ward.D2")

Clusters of regions