



UNIONE EUROPEA  
Fondo Europeo di Sviluppo Regionale



*Mitigazione dei rischi naturali per la sicurezza e la mobilità  
nelle aree montane del Mezzogiorno: Il contributo dei Collaboratori di Ricerca*

# UNCOVERING INTRA-RURAL DIVIDE VIA CLUSTERING ALGORITHMS

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*Ruolo: Contrattista*

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# Rural areas

the preservation of rural areas  
landscape and investment in rural  
areas' development emerge as  
relevant aims of European policies

# Rural decline:

a process resulting in a significant decrease of population over a period equal to or superior than a generation. Active shrinkage is a result of out migration. Legacy shrinkage is a consequence of natural population decrease and regions' age structure.

# Intra - Rural Divide:

a concept that recognises distinct forms of decline, the related specific configurations of socio-economic determinants and the emergence of specific rural areas as centers of sustainable development based on multi-functional economies.

# Territorial Capital:

The specific set of local tangible and non-tangible resources of a region that determine the area's potential of development and its development trajectories

(OECD 2001; Camagni 2009; Camagni & Capello 2013; Orsi et al. 2022) .

# Territorial Capital

Underlines the specific provision of factors of development, enabling the understanding of specificities of Regions. As a result, it emerges as a useful conceptual apparatus for framing and investigating intra-rural divide (Fratesi & Perucca 2017; Boczy & Cordini 2020) .

# Human Capital

is a component of TC related to the set of competences and abilities of a population. HC emerges as a significant determinant of development and of resilience in relation to exogenous socio-economic events (Mazzola et al. 2018) and adaptation and reconversion of local economies (Fratesi & Perucca 2017) .

# Human Capital

is a component of TC related to the set of competences and abilities of a population. HC is a determinant of development, of resilience (Mazzola et al. 2018) and adaptation and reconversion of local economies (Fratesi & Perucca 2017) .

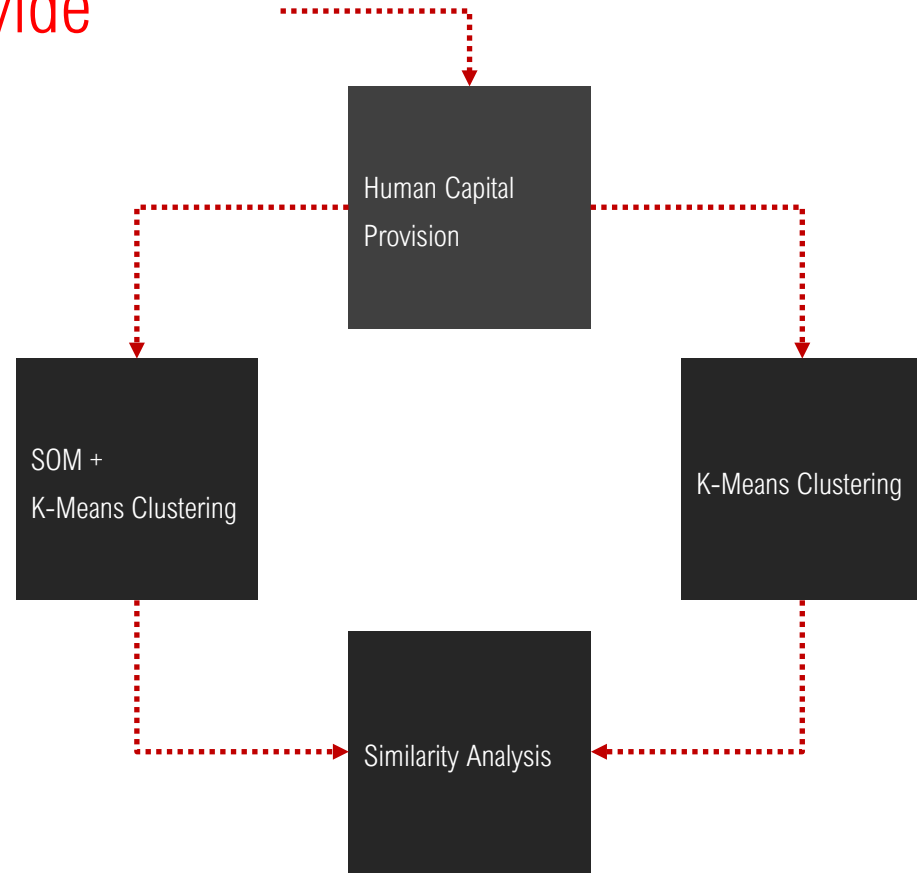
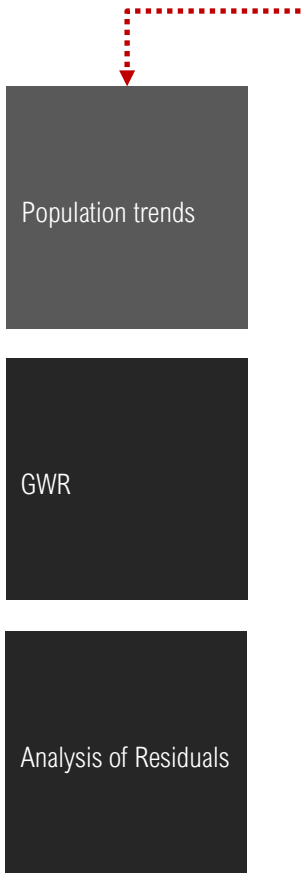


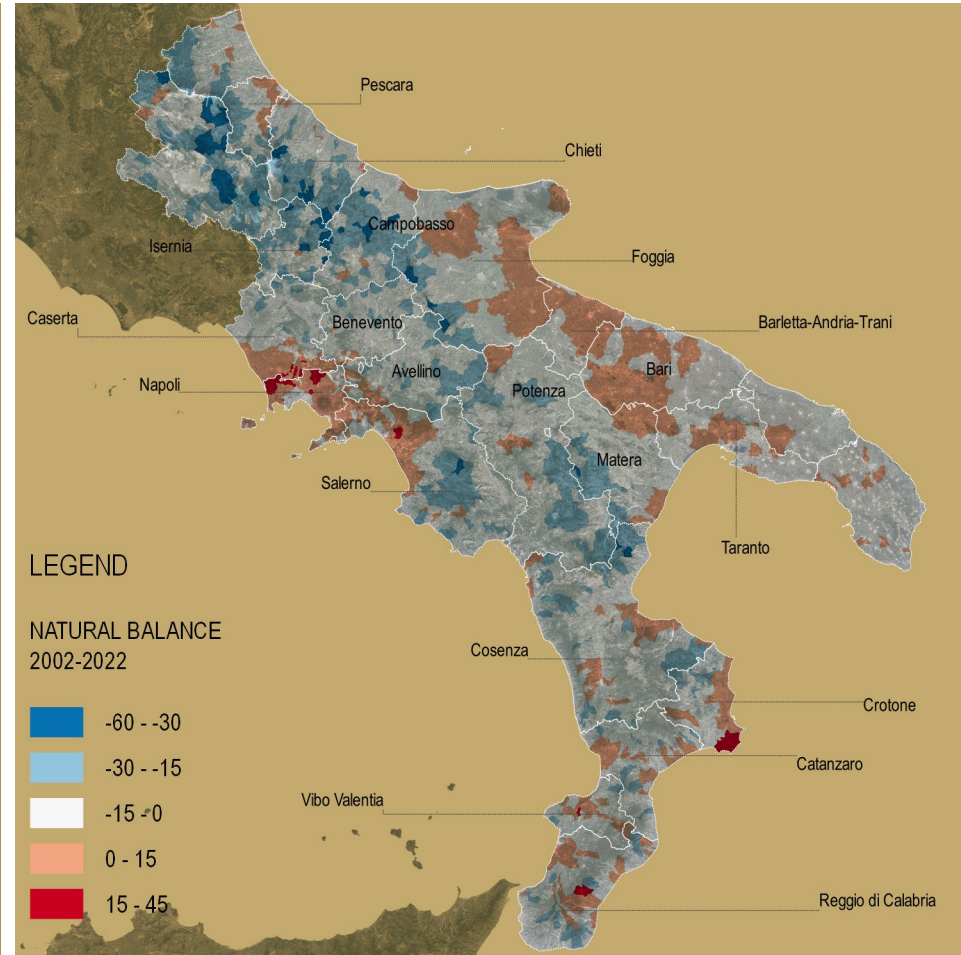
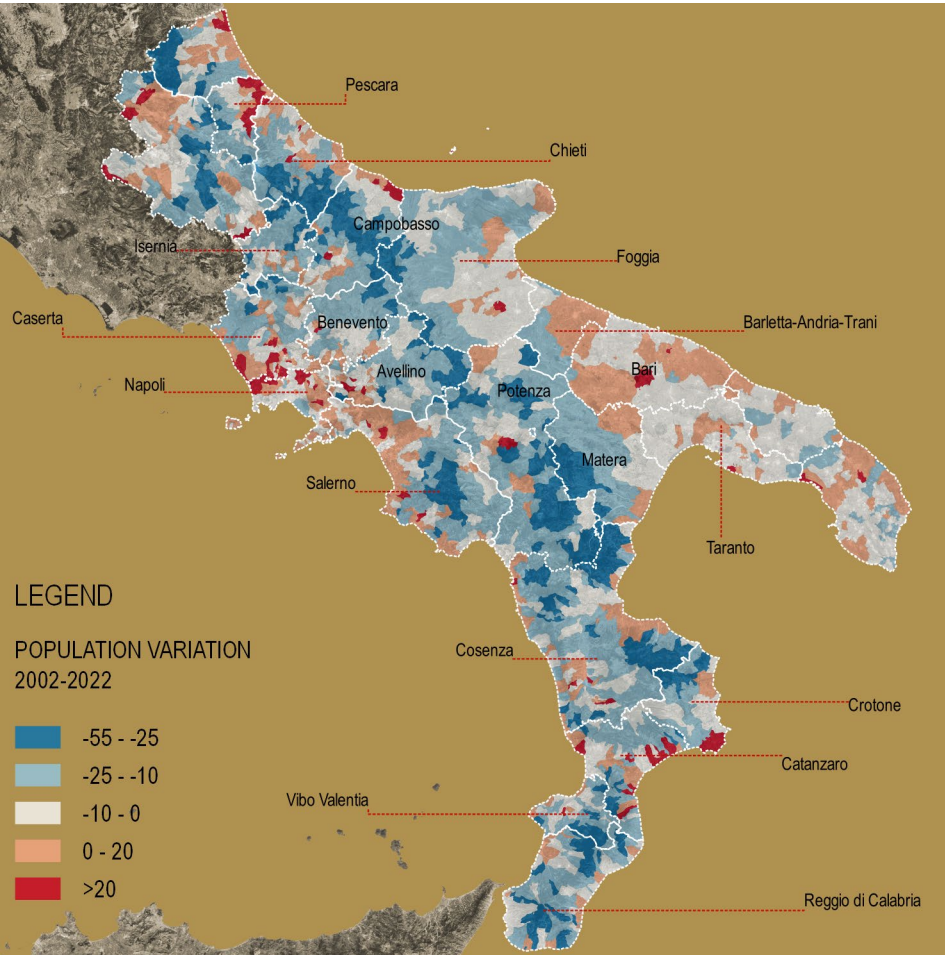
# Research question:

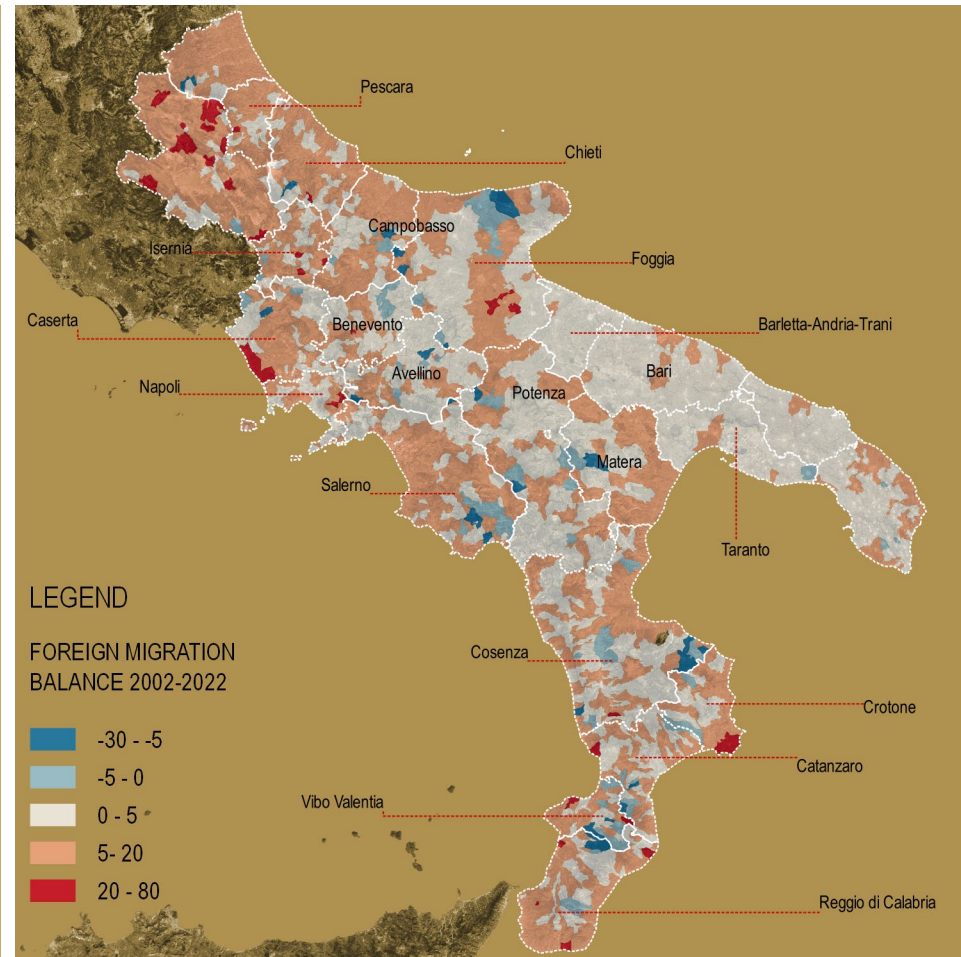
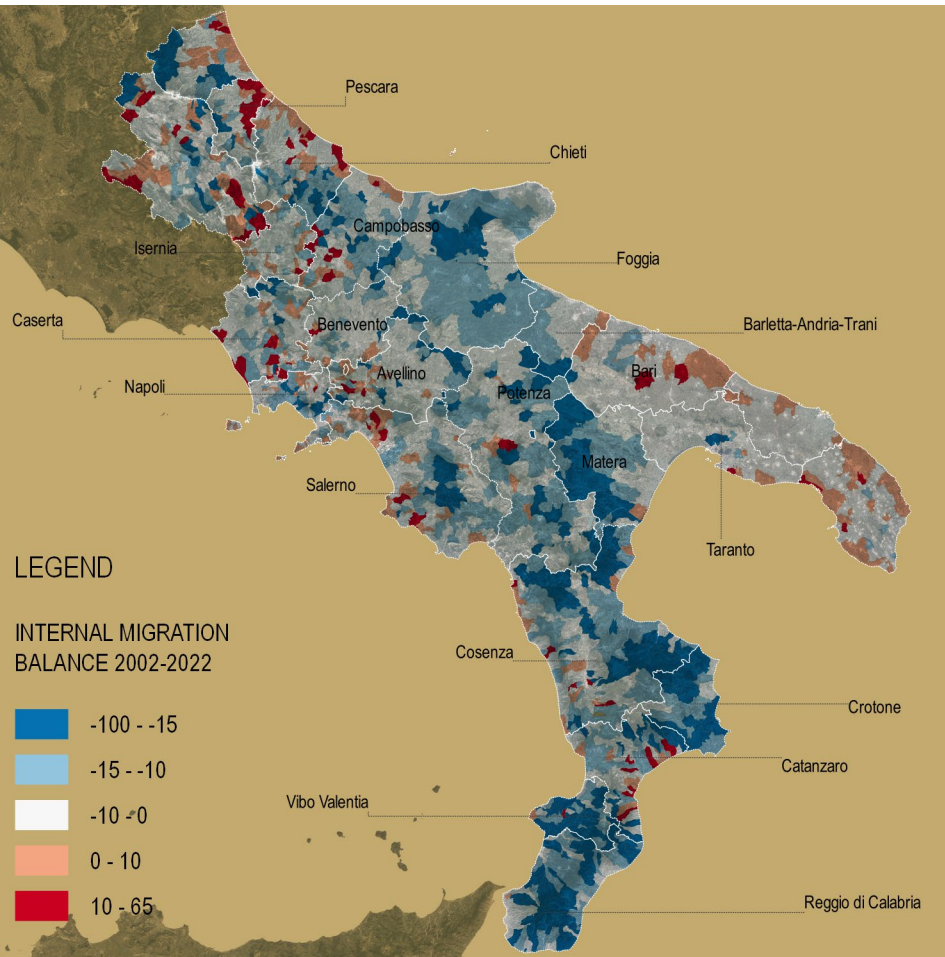
Development of metrics for discerning regions presenting specific configurations of social, economic and spatial conditions.

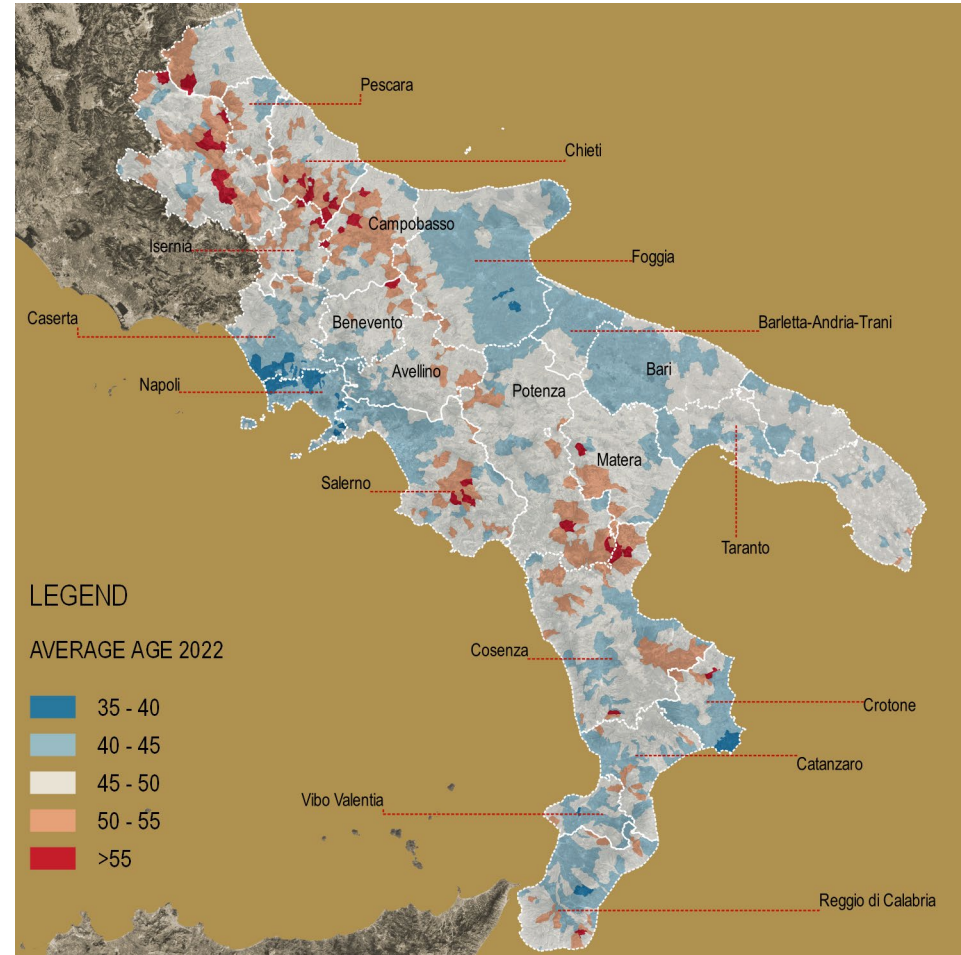
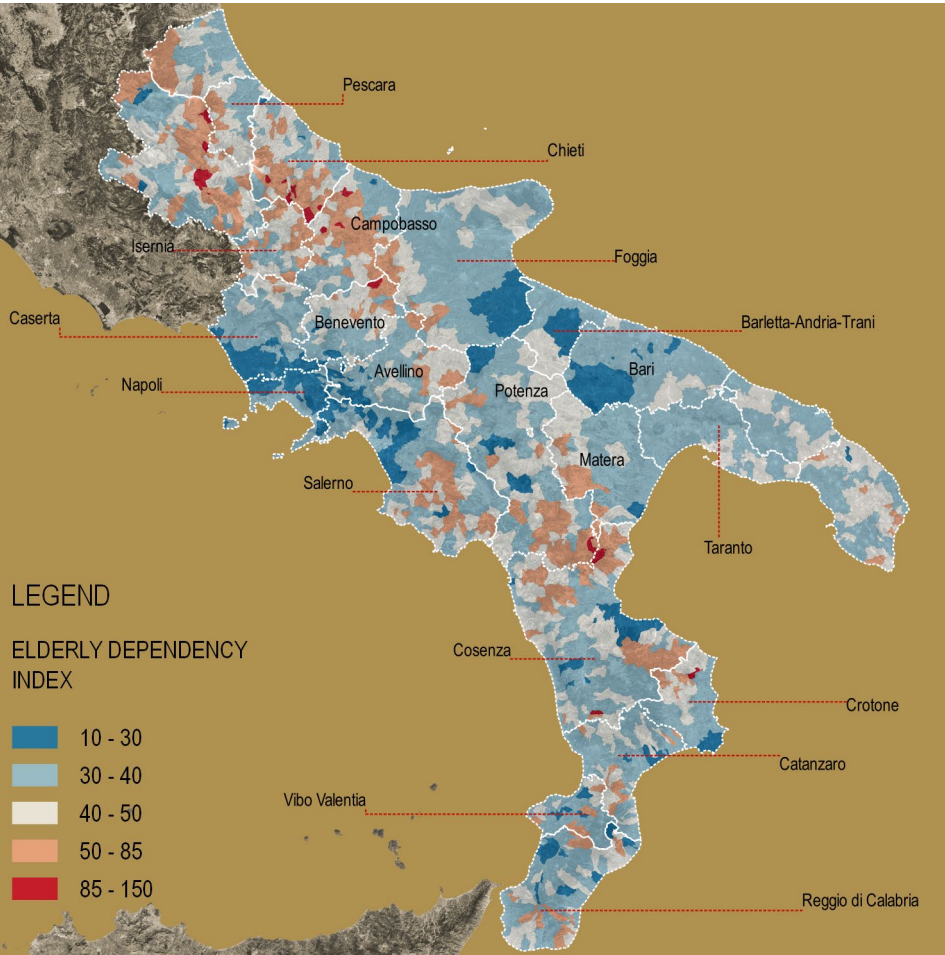
# Intra-rural Divide

Variation of Population



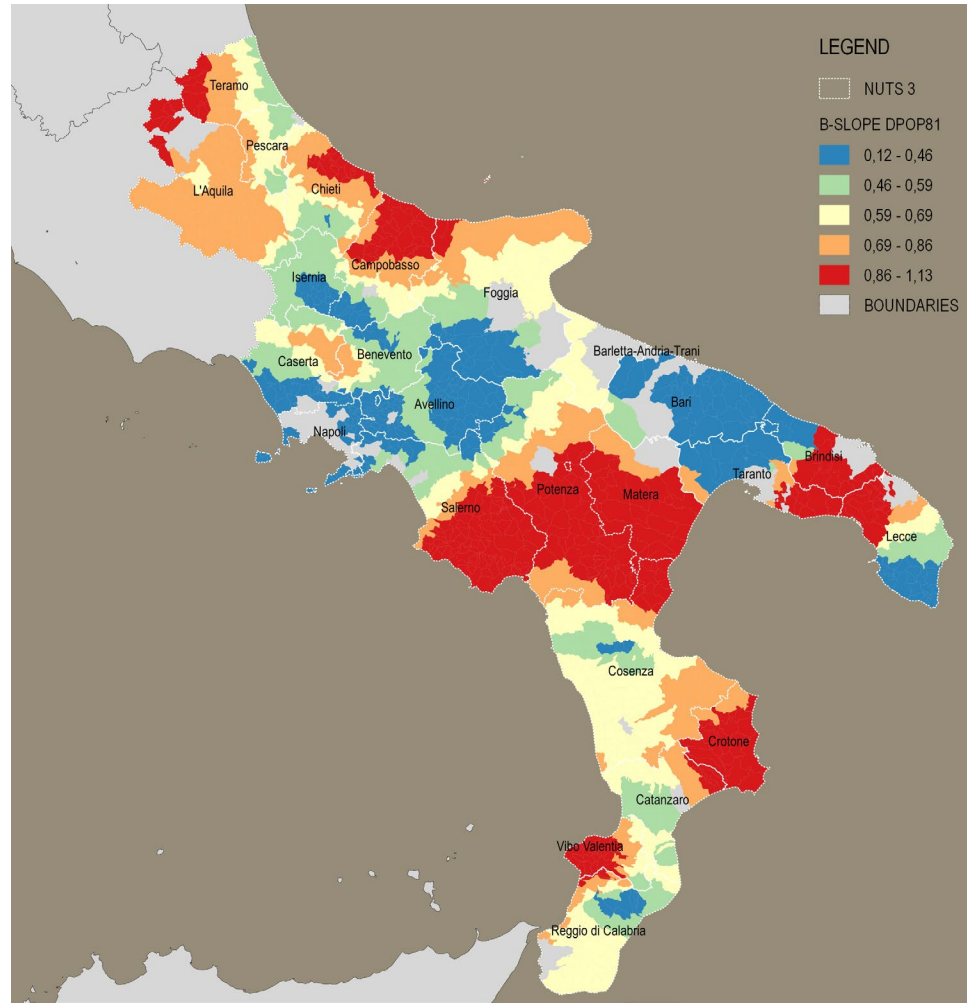


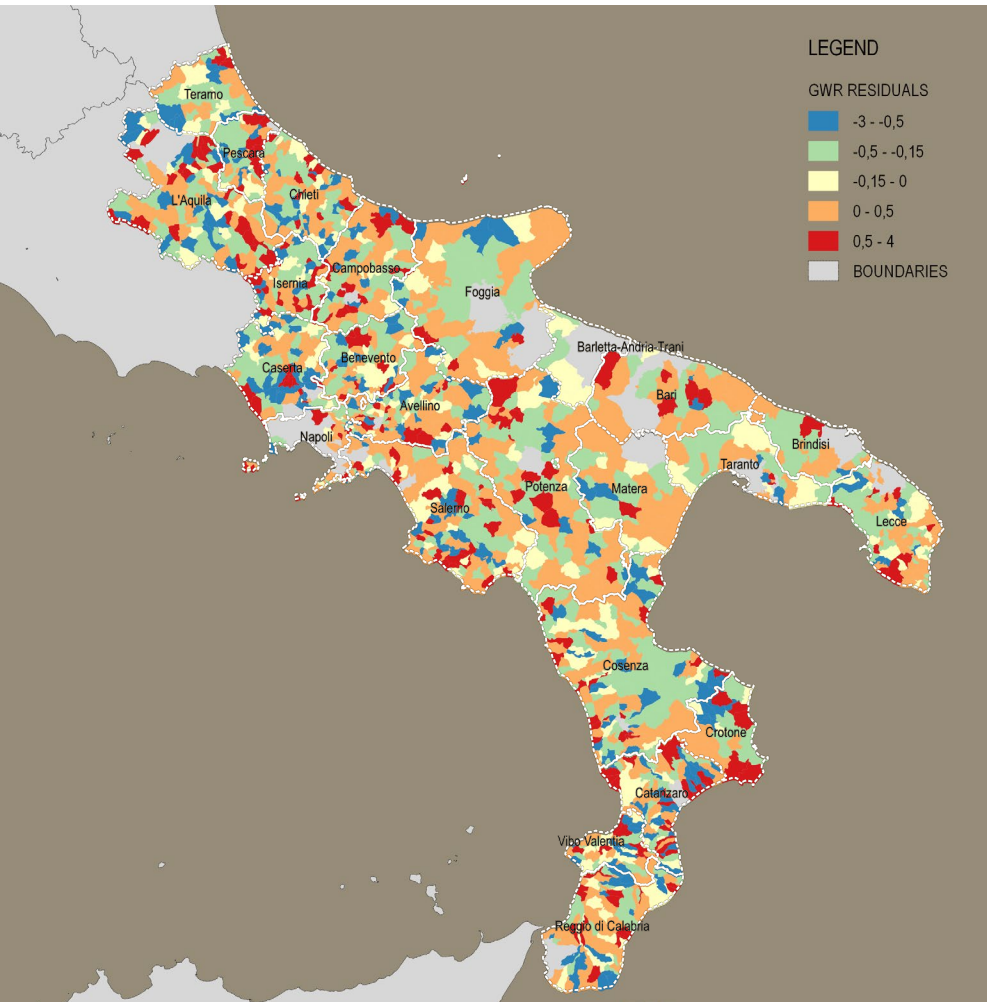




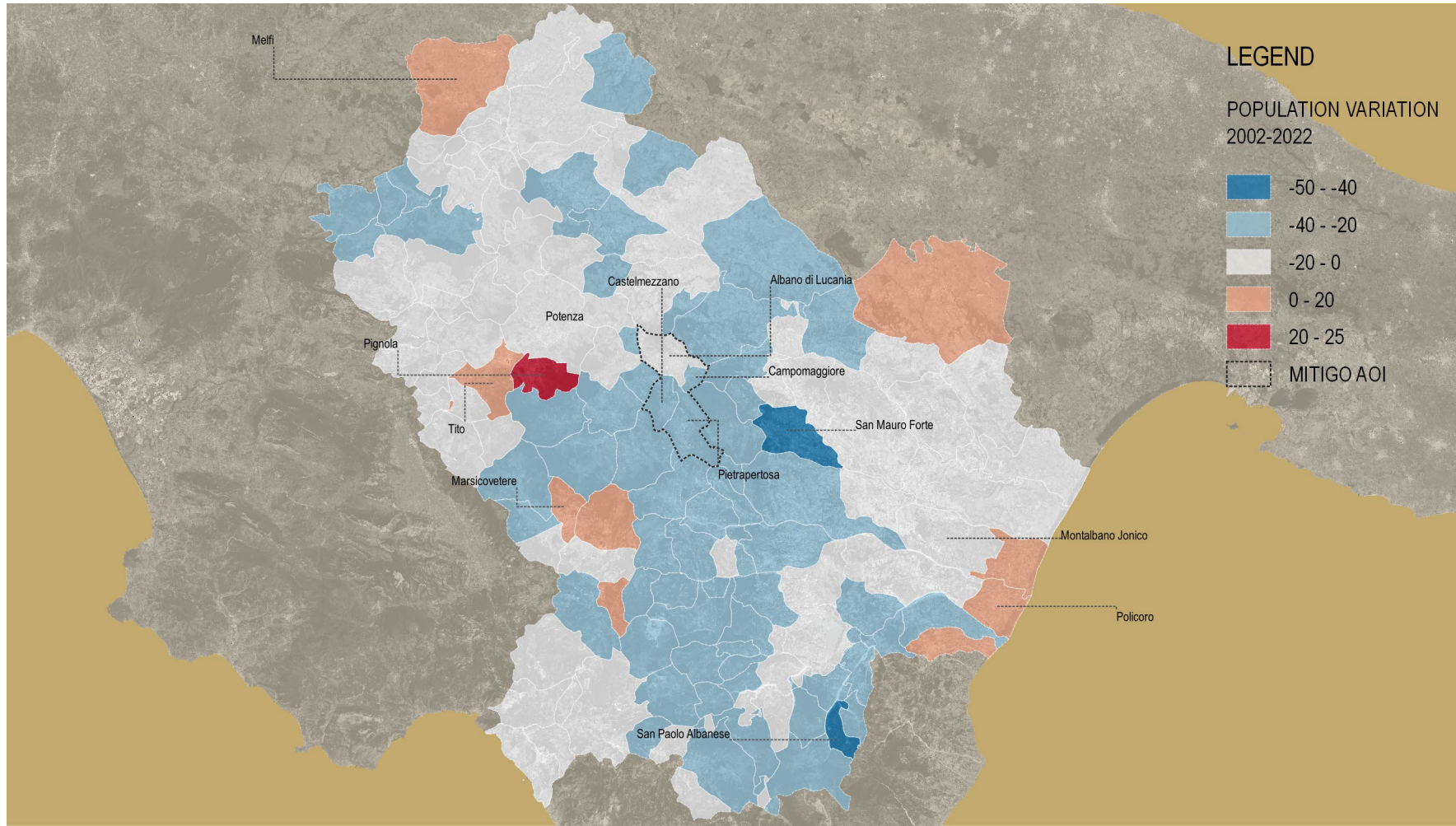
## GWR

The spatial regression underlines that Population Variation in the 1981-2001 period is significantly and positively related to Population Variation in the 2002-2022 period

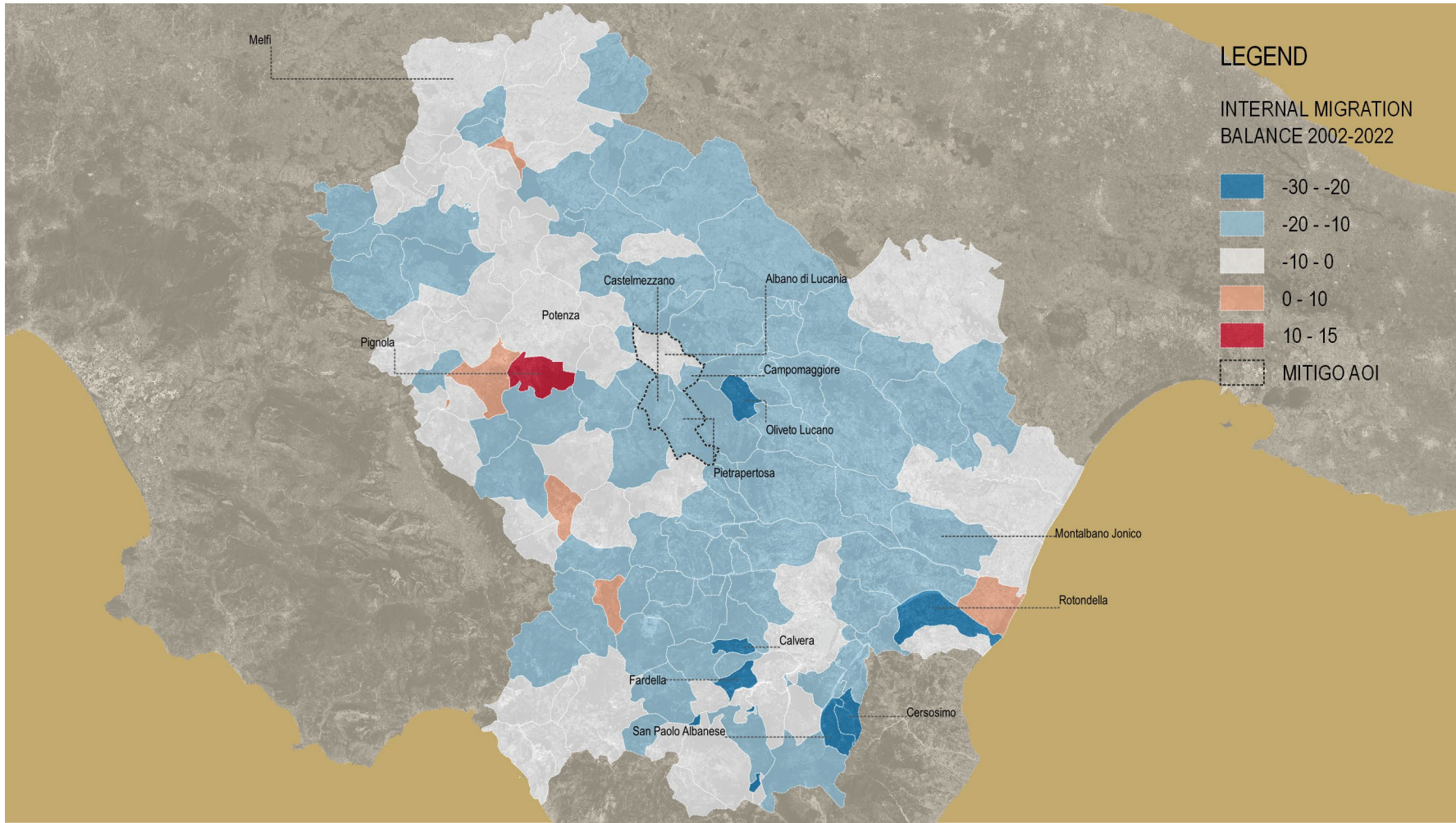


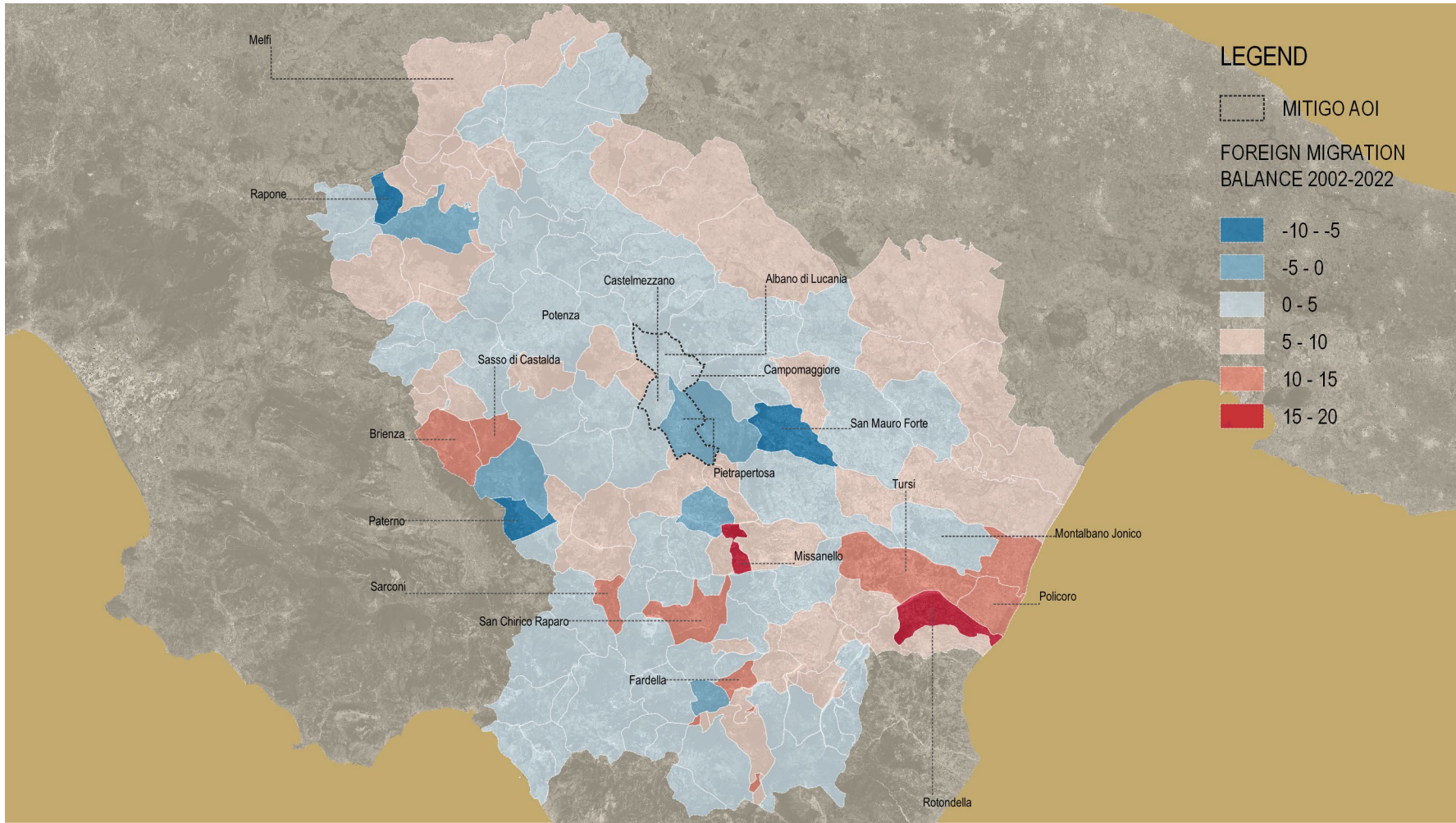


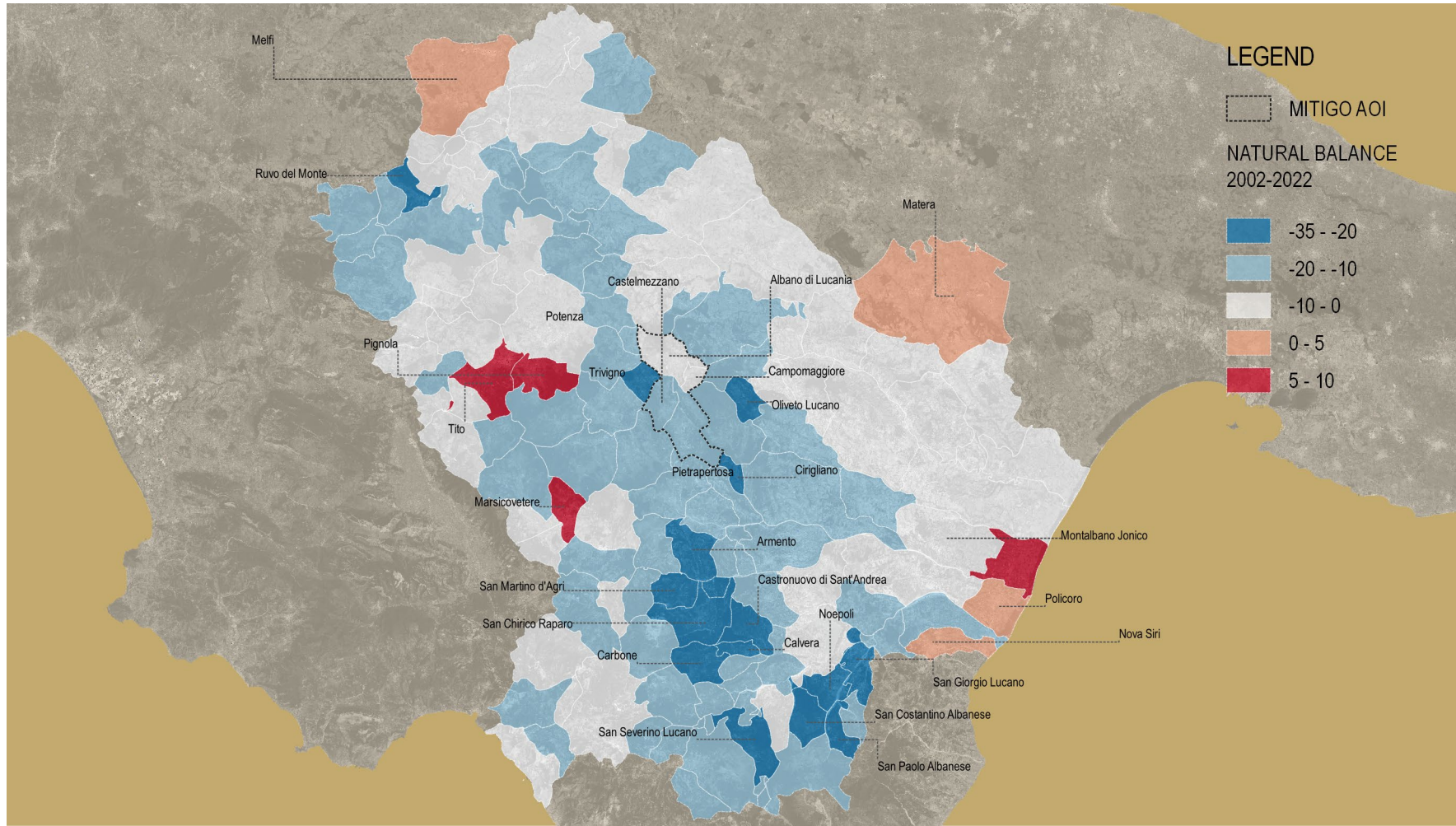
**Residuals**  
of the GWR of Population Variation  
in the 2002-2022 period on  
Population Variation in the 1981-  
2001 period underlines the co-  
presence of population trends  
presenting specific direction and  
intensities

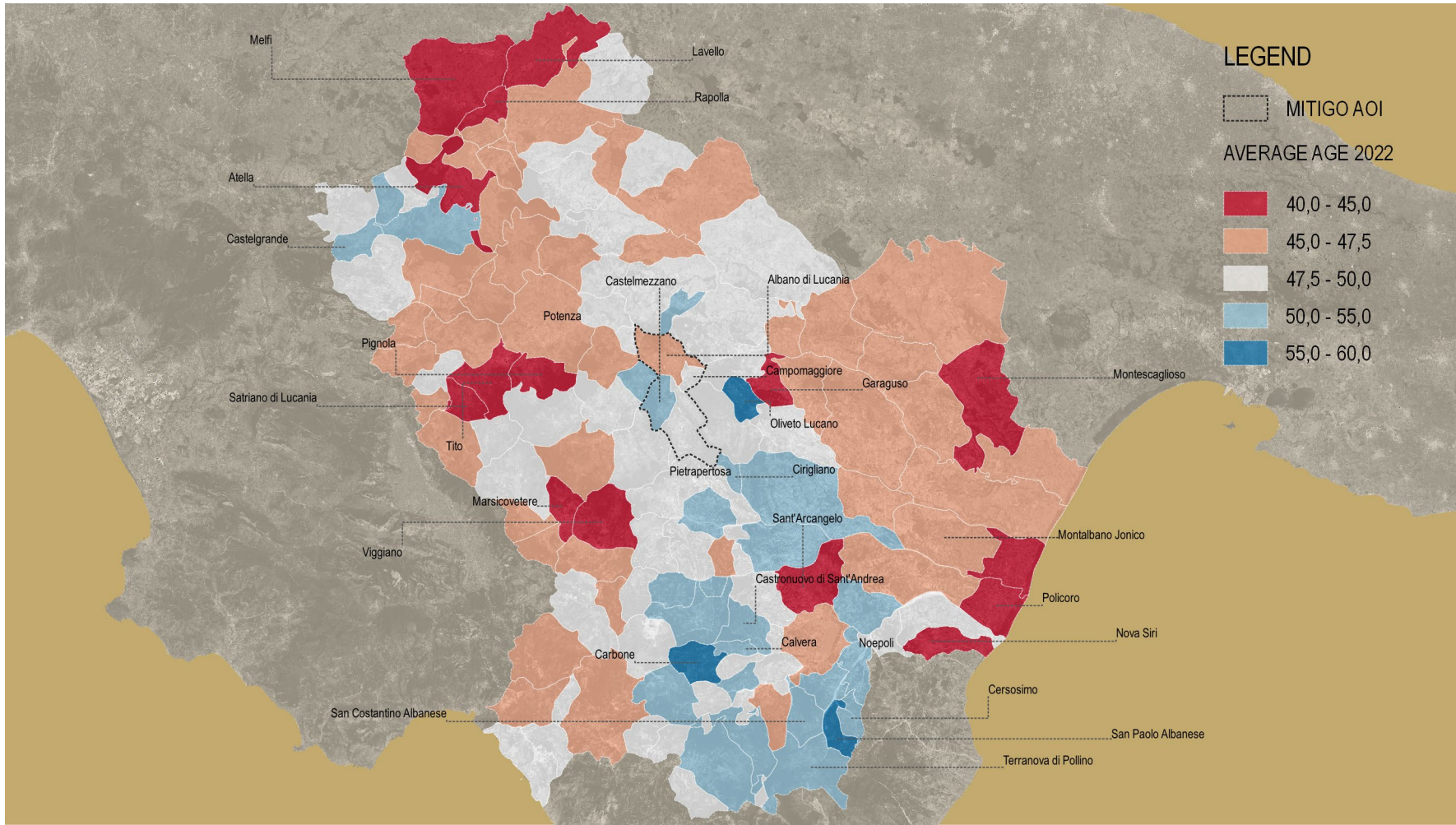


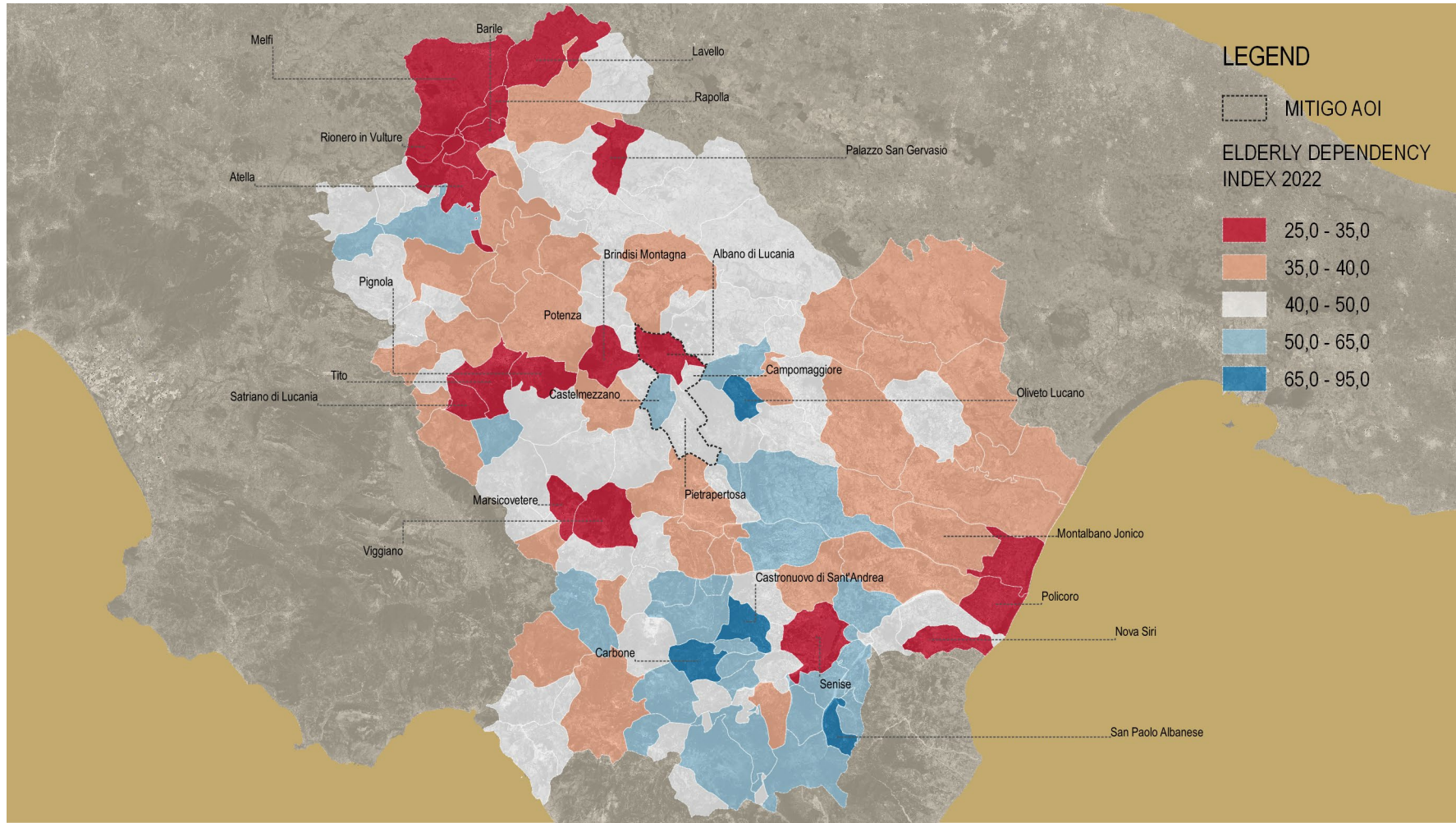






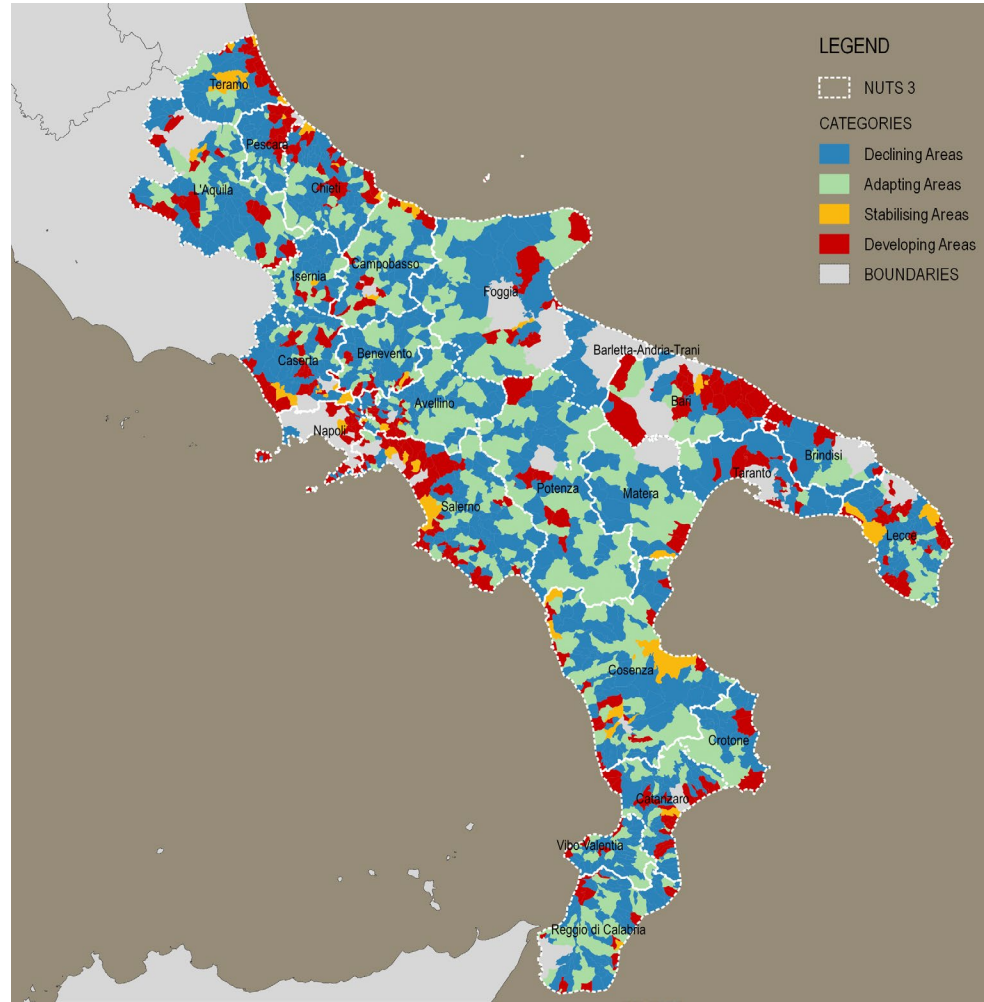






## The Categories

of municipalities based on population trends underline the prevalence of declining municipalities (847 out of 1683 observations, equal to 50.3%), the emergence of a relevant cluster of adapting municipalities (473 out of 1683 observations equal to 28.1%) and of developing areas (306 out of 1683 municipalities, equal to 18.2%) and the mod-est incidence of stabilising municipalities (57 out of 1683 observations equal to 3.4%).

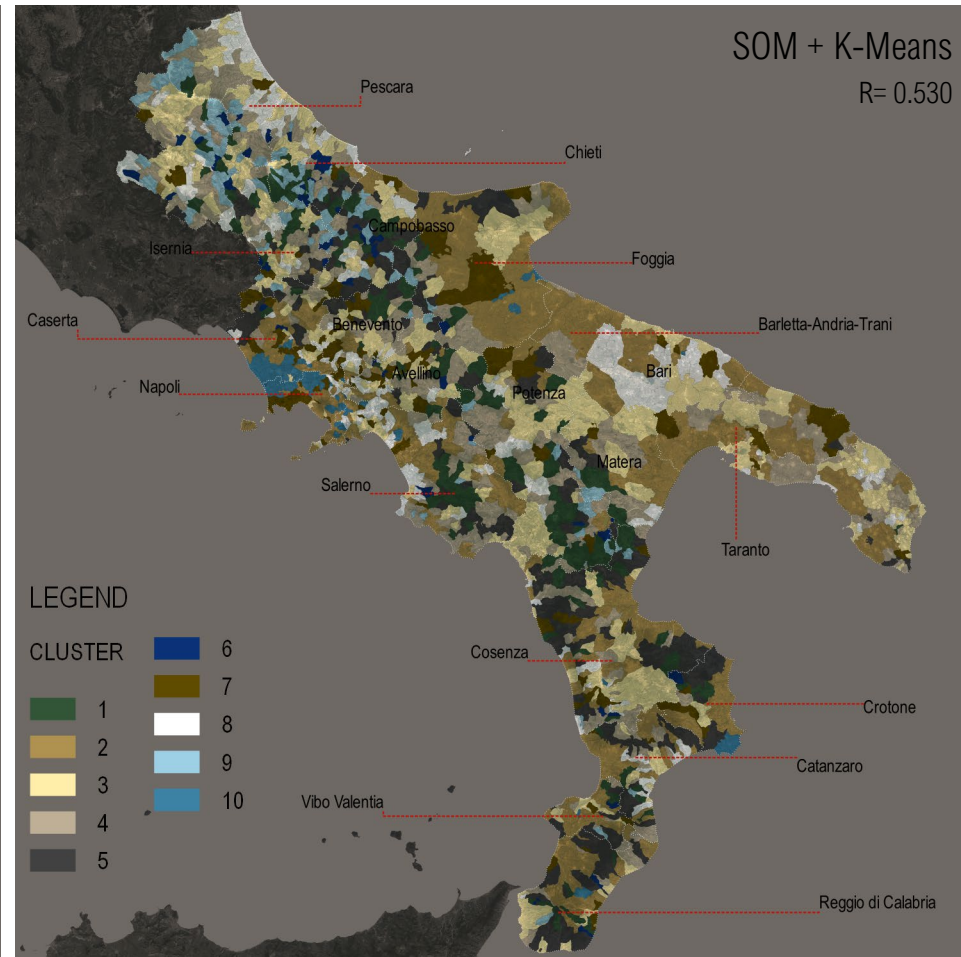
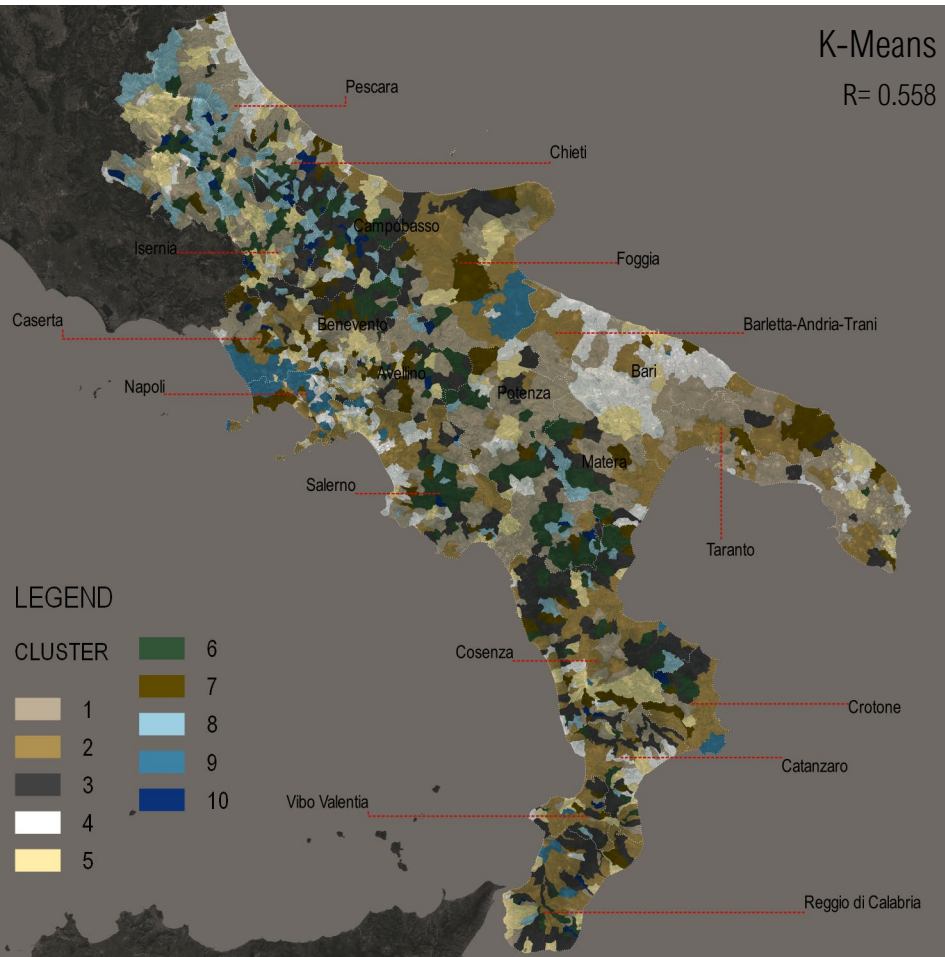


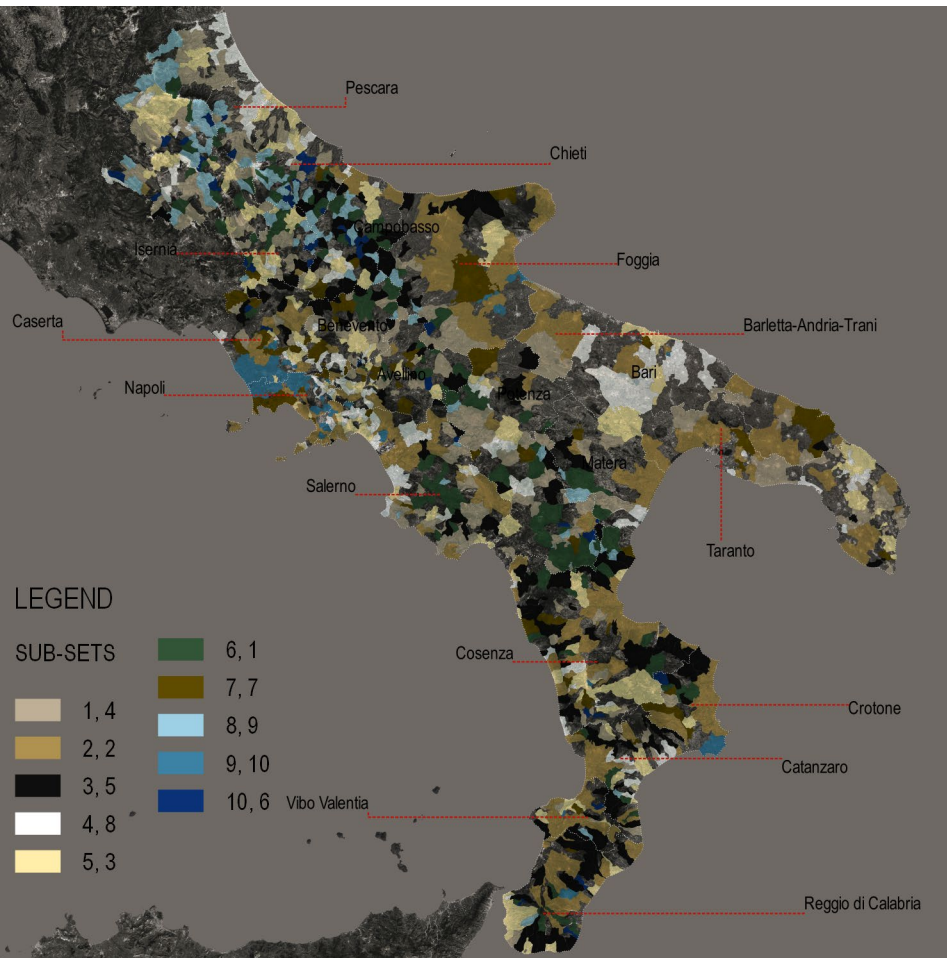


INDICATOR	DEFINITION	EQUATION		
DPOP_T02	Population Variation in the 2002-2022 period	$(POP_{2022} - POP_{2002}) / POP_{2002}$	POP <sub>2022</sub> POP <sub>2002</sub>	Population at Year 2022 Population at Year 2002
SMI22_02	Total Internal Migration Balance in the 2002-2022 period	$(\sum(I_{ij} - IE_{ij})) / POP_{2002}$	FI <sub>j</sub> FE <sub>j</sub>	number of migrants from other municipalities at Year J number of emigrants to other municipalities at Year J
SME22_02	Total Foreign Migration Balance in the 2002-2022 period	$(\sum(FI_j - FE_j)) / POP_{2002}$	FI <sub>j</sub> FE <sub>j</sub>	number of migrants from foreign Countries at Year J number of emigrants to foreign Countries at Year J
SN22_02	Total Natural Balance in the 2002-2022 period	$(\sum(B_j - D_j)) / POP_{2002}$	B <sub>j</sub> D <sub>j</sub>	number of newborns at Year J number of deceased individuals at Year J
AGEI	Average Age Indicator (2022)	$(1/A) * 100$	A	Average Age
DEPE22	Elderly Dependency Index (2022)	$(1 / (NI_{>65} / NI_{0-14})) * 100$	NI>65 NI0-14	Number of individuals of age > 65 Y Number of individuals aged 0-14 years



INDICATOR	DEFINITION	EQUATION		
RPA22	Voting Participation rate (General Election, 2022)			Data from Italian Ministry of Interior
VRPA22	Variation of Voting Participation Rate	$RPA_{22} - RPA_{18}$	$RPA_{22}$ $RPA_{18}$	Voting participation rate in 2022 Voting participation rate in 2018
VA_2020	Added Value per employee in Local Units (2020)			ISTAT Data
R_HT_EM	Incidence of High Technology enterprises in terms of employed individuals			ISTAT Data
TEDUT	Proportion of individuals with tertiary education on the population aged 25-64 years	$(NTT/NI_{25-64})$	NTT NI>9	Number of Individuals with Tertiary education at year J Number of Individuals aged 25-64 years
RENRT	Proportion of enrolment to tertiary education on the population aged 18-24 years	$(NET/NI_{18-24})$	NET NI>9	Number of enrolments to Tertiary education at year J Number of Individuals aged 18-24 years





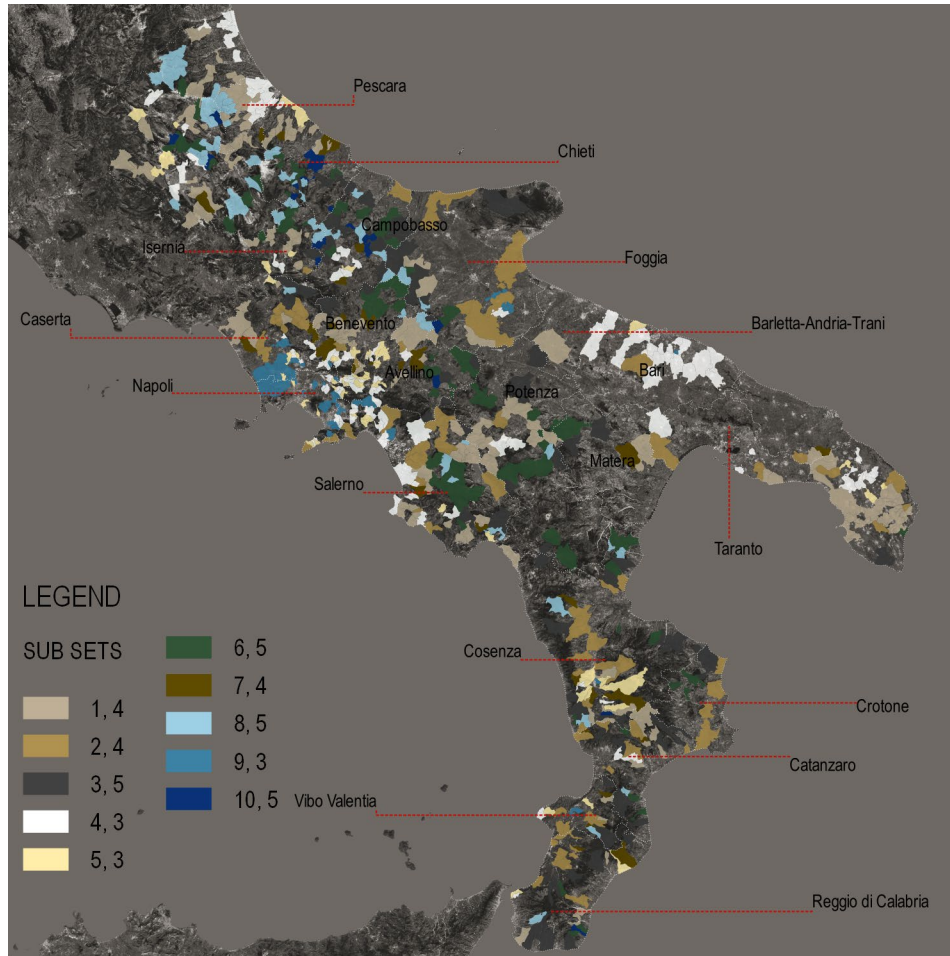
## Similarity Analysis

KM10SOM

KM10	1	2	3	4	5	6	7	8	9	10
1	0.03	0.04	0.24	0.60	0.00	0.00	0.00	0.08	0.01	0.00
2	0.00	0.86	0.01	0.05	0.05	0.00	0.01	0.01	0.00	0.00
3	0.03	0.02	0.00	0.20	0.75	0.00	0.00	0.00	0.00	0.00
4	0.00	0.15	0.01	0.01	0.00	0.00	0.09	0.75	0.00	0.00
5	0.01	0.00	0.80	0.00	0.00	0.00	0.15	0.05	0.00	0.00
6	0.72	0.00	0.14	0.01	0.08	0.00	0.00	0.00	0.05	0.00
7	0.11	0.00	0.11	0.12	0.03	0.04	0.60	0.00	0.00	0.00
8	0.01	0.00	0.00	0.16	0.08	0.00	0.00	0.00	0.75	0.00
9	0.00	0.19	0.00	0.00	0.00	0.00	0.00	0.01	0.00	0.80
10	0.05	0.00	0.00	0.00	0.00	0.95	0.00	0.00	0.00	0.00

## Similarity Analysis

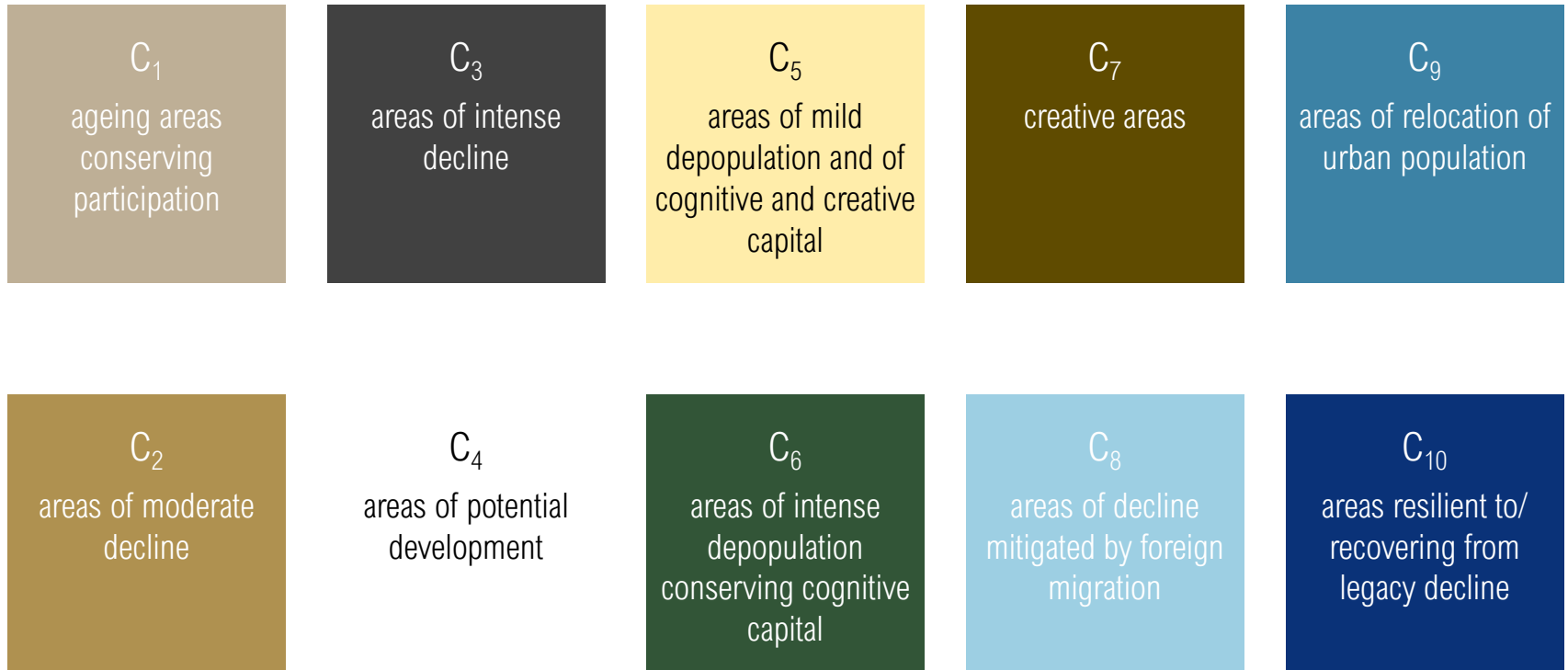
SNAI							
KM10	1	2	3	4	5	6	
1	0.01	0.02	0.24	0.44	0.24	0.06	1.00
2	0.03	0.04	0.31	0.32	0.27	0.03	1.00
3	0.00	0.00	0.06	0.34	0.46	0.14	1.00
4	0.04	0.05	0.64	0.20	0.07	0.02	1.00
5	0.16	0.01	0.38	0.27	0.17	0.02	1.00
6	0.00	0.00	0.04	0.29	0.52	0.16	1.00
7	0.04	0.02	0.31	0.33	0.24	0.06	1.00
8	0.00	0.00	0.02	0.23	0.53	0.22	1.00
9	0.01	0.10	0.75	0.12	0.01	0.00	1.00
10	0.00	0.00	0.13	0.33	0.44	0.10	1.00



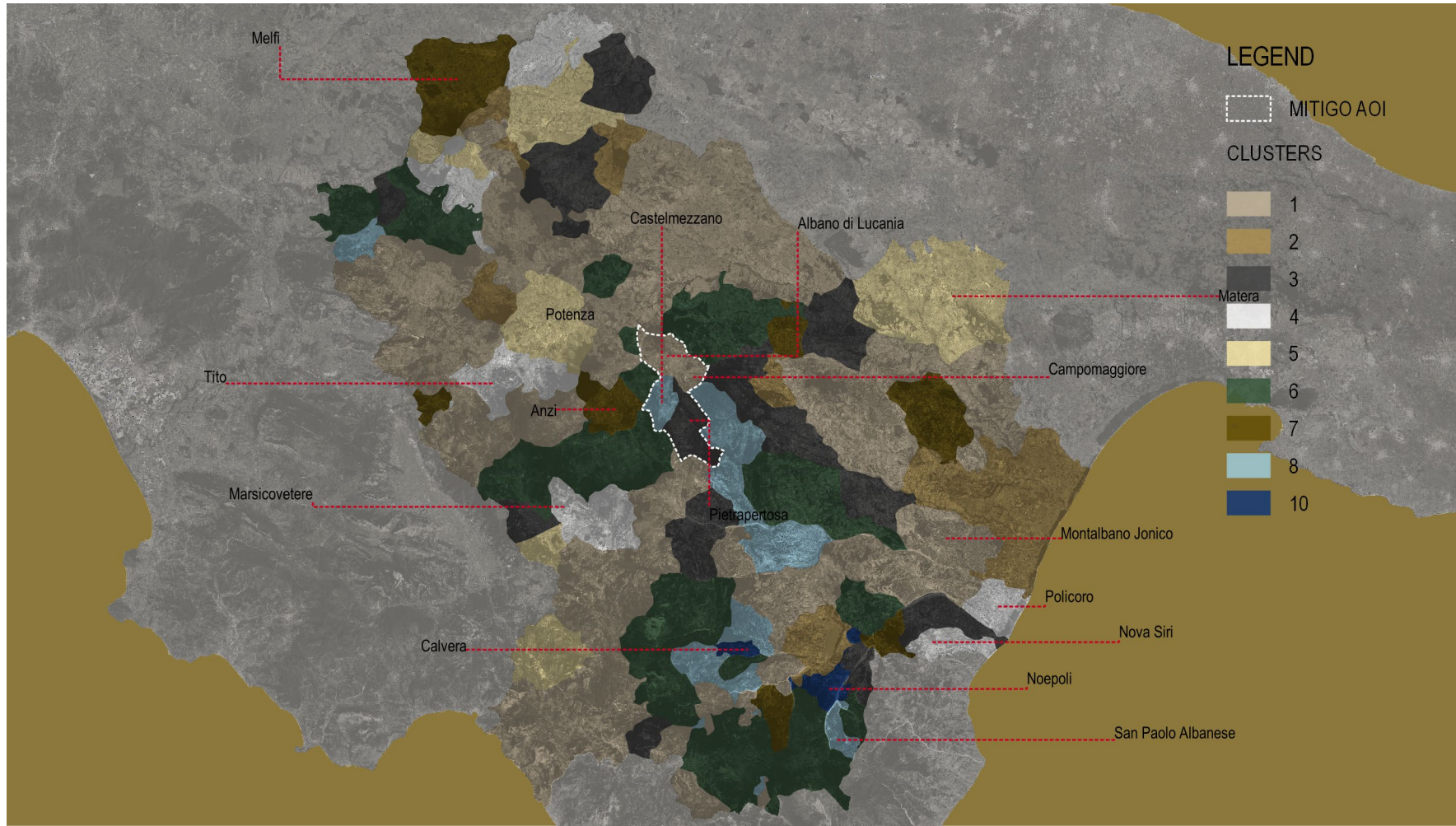
HC derived LAU Clusters vs SNAI Categories

I	C <sub>1</sub>	C <sub>2</sub>	C <sub>3</sub>	C <sub>4</sub>	C <sub>5</sub>	C <sub>6</sub>	C <sub>7</sub>	C <sub>8</sub>	C <sub>9</sub>	C <sub>10</sub>
DPOP_T02	-	(-10.72) 6.50***	(-7.65) -14.65***	(-12.44) 24.52***	(-10.32) 6.52***	(-8.05) -17.84***	-	(-8.57) -18.92***	(-11.02) 26.16***	(-9.37) -15.52***
SMI22_02	-	-	(-62.15) -69.19***	(-86.69) 133.29***	(-74.80) 31.24***	(-66.86) -54.03***	-	(-69.36) -41.68***	(-74.10) 44.36***	-
SME22_02	-	-	(64.24) -28.97***	-	-	-	-	(58.79) 22.50***	(59.07) 21.82**	(59.17) 45.34***
SN22_02	-	(-97.93) 81.17***	(-77.94) -53.09***	(-97.37) 107.72***	(-88.25) 30.48***	(-73.88) -123.83**	-	(-74.70) -176.84**	(-95.64) 204.87***	(-81.36) -185.15**
RPA22	(54.77) 6.22***	(57.04) -6.16***	(57.30) -8.56***	(55.66) 3.95***	(55.75) 3.70***	-	-	(55.87) 3.74***	(56.31) -4.35***	(56.02) 3.30**
V_RPA	(-13.56) 2.24***	(-12.53) -3.53***	(-12.71) -2.64***	-	-	(-13.33) 2.73***	(-12.97) -1.74***	(-13.46) 6.33***	(-12.85) -4.47***	(-13.19) 5.22***
VA_2020	-	-	(26.03) -3.86***	(25.10) 3.44***	-	(25.94) -4.82***	(25.18) 4.80***	(25.69) -3.43*	-	-
R_HT_EM	(20.47) -4.09***	(20.31) -4.59***	(20.34) -5.24***	-	(19.11) 5.24***	-	(18.34) 20.01***	(20.12) -8.61***	-	(18.71) 40.49***
AGE22I	(2.14) -0.03***	(2.12) 0.14***	(2.15) -0.097***	(2.12) 0.16***	-	(2.16) -0.21***	-	(2.15) -0.26***	(2.12) 0.37***	(2.14) -0.22***
EDI	(2.61) -0.20***	(2.49) 0.46***	(2.64) -0.49***	(2.48) 0.75***	-	(2.64) -0.78***	-	(2.62) -0.96***	(2.47) 1.93***	(2.58) -0.79***
TEDUT	-	(17.97) -2.90***	(18.01) -3.46***	(17.28) 2.17***	(16.73) 8.56***	(17.32) 2.25***	-	(17.73) -3.36***	(17.70) -3.43***	-
RENRT	-	(16.87) -2.76***	(16.67) -1.61***	-	(15.97) 5.10***	(15.79) 7.06***	-	(16.77) -5.26***	(16.61) -3.27***	-

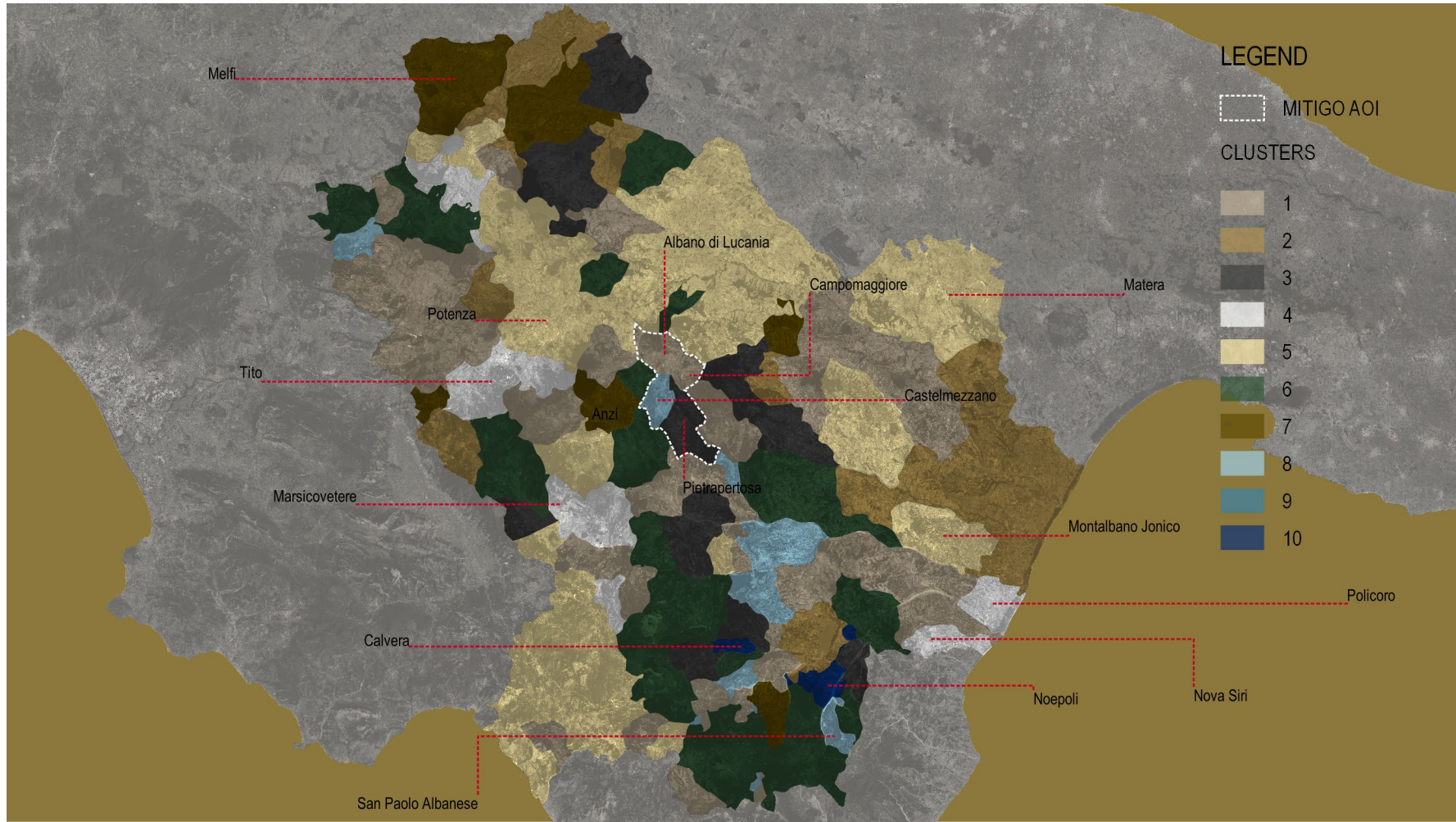
HC derived LAU Clusters



Qualification of LAU Clusters

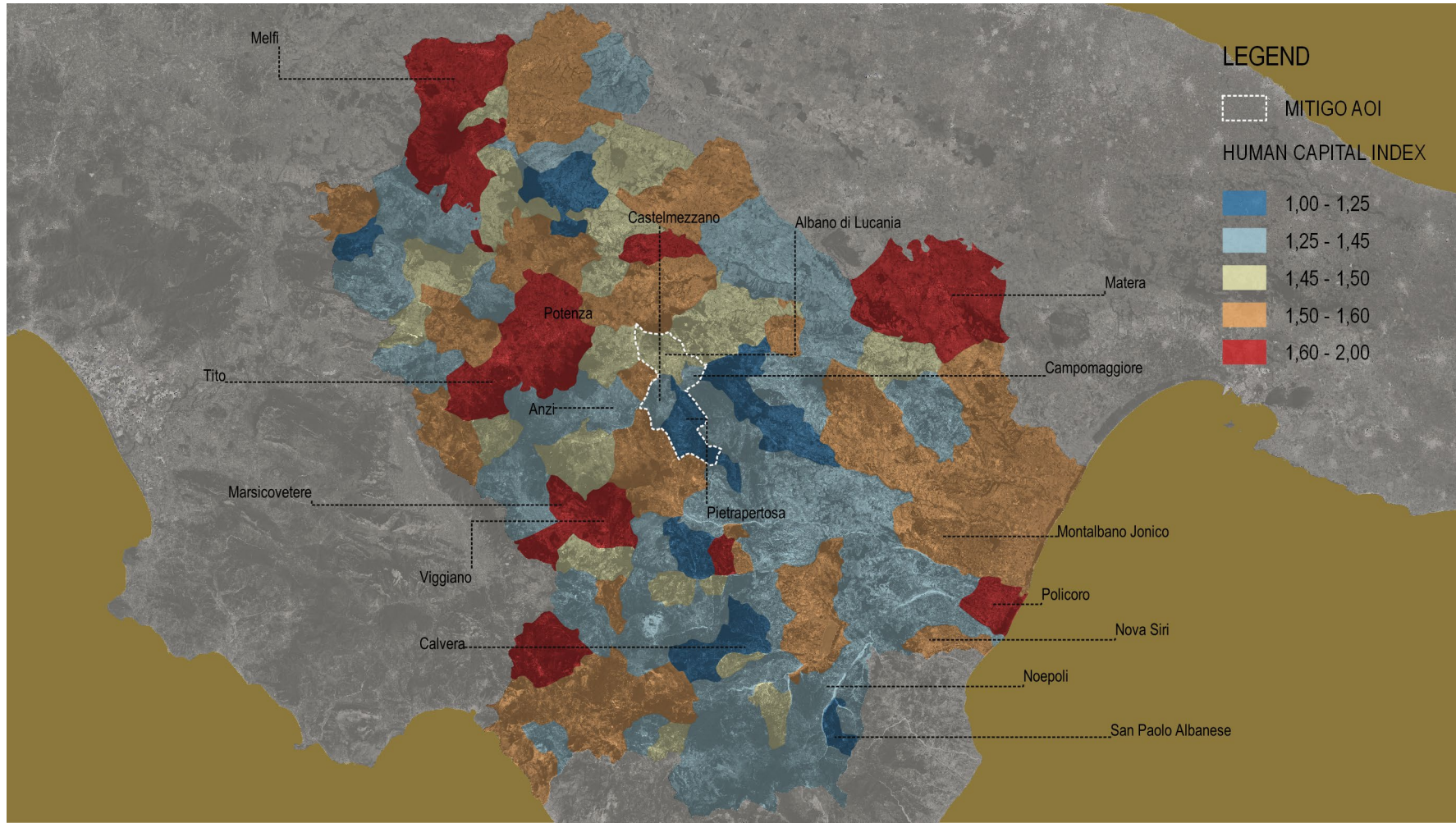


K-Means  
R= 0.558



SOM +  
K-Means  
R= 0.530





Formulating Place-based strategies

Adaptation Strategies

Aimed at improving life conditions of the resident population

Retain Population

Mitigation Strategies

Aimed at reducing the impact of exogenous forces including global trade liberalization, labor segmentation and marginalization of rural areas

Invert depopulation trends

Development Strategies

Aimed at mobilizing local resources for promoting economic restructuring

Invert depopulation trends

<p>C<sub>1</sub> ageing areas conserving participation</p>	<p>C<sub>3</sub> areas of intense decline</p>	<p>C<sub>5</sub> areas of mild depopulation and of cognitive and creative capital</p>	<p>C<sub>7</sub> creative areas</p>	<p>C<sub>9</sub> areas of relocation of urban population</p>
<p>Adaptation + Development Policies</p>	<p>Adaptation Policies</p>	<p>Adaptation + Development Policies</p>	<p>Mitigation + Development Policies</p>	<p>Mitigation + Development Policies</p>
<p>C<sub>2</sub> areas of moderate decline</p>	<p>C<sub>4</sub> areas of development</p>	<p>C<sub>6</sub> areas of intense depopulation conserving cognitive capital</p>	<p>C<sub>8</sub> areas of decline mitigated by foreign migration</p>	<p>C<sub>10</sub> areas resilient to/ recovering from legacy decline</p>
<p>Development Policies</p>	<p>Development Policies</p>	<p>Adaptation + Development Policies</p>	<p>Adaptation+ Development Policies</p>	<p>Adaptation+ Mitigation+ Development Policies</p>

Assist Public  
Institutions  
in:

1

Understanding intra-  
rural divide

2

Individuation of areas  
of non-reversible  
decline

3

Enabling cooperation  
among areas  
presenting similar  
conditions

4

Formulating targeted  
place-based  
strategies strategies



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## *Mitigazione dei rischi naturali per la sicurezza e la mobilità nelle aree montane del Mezzogiorno: Il contributo dei Collaboratori di Ricerca*

Estratto dagli Atti del Convegno: Il contributo dei Collaboratori di Ricerca del progetto MITIGO presso l'Università della Basilicata

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