

A satellite map of Europe, showing the continent's landmasses in shades of green and brown, surrounded by dark blue oceans. The map is the background of the entire slide.

Assessing a Spatially Explicit Zipf's Law for Population Density

FROM GLOBAL
ECONOMETRIC PANELS TO
LOCAL APPROACHES

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Zipf's Law: a brief review

Pareto distribution

$$R = A P^{-\alpha}$$

(Auerbach)

$$\text{Log}(R) = \text{Log}(A) - \alpha \text{Log}(P)$$

(Singer)

R : Rank of a city

P : Population of a city

A : City size constant

α : Pareto exponent

Zipf specification

$$P = \frac{K}{R^q}$$

$$P = K R^{-q}$$

$$\text{Log}(P) = \text{Log}(K) - q \text{Log}(R)$$

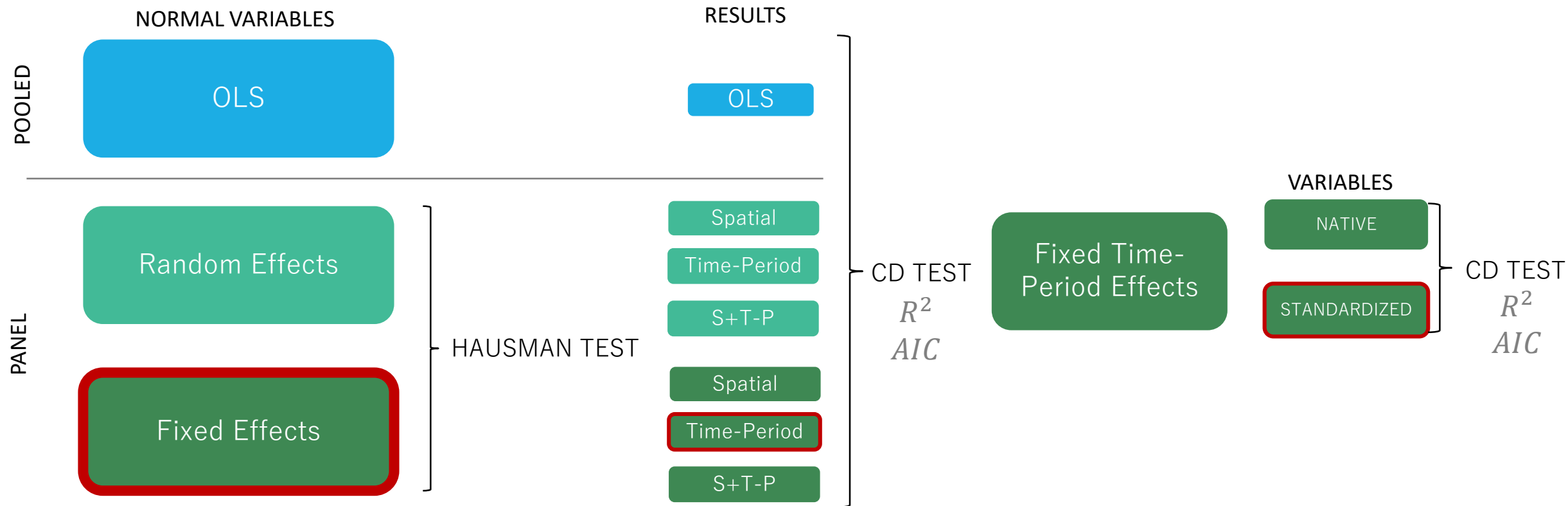
K : City size constant

q : Zipf exponent

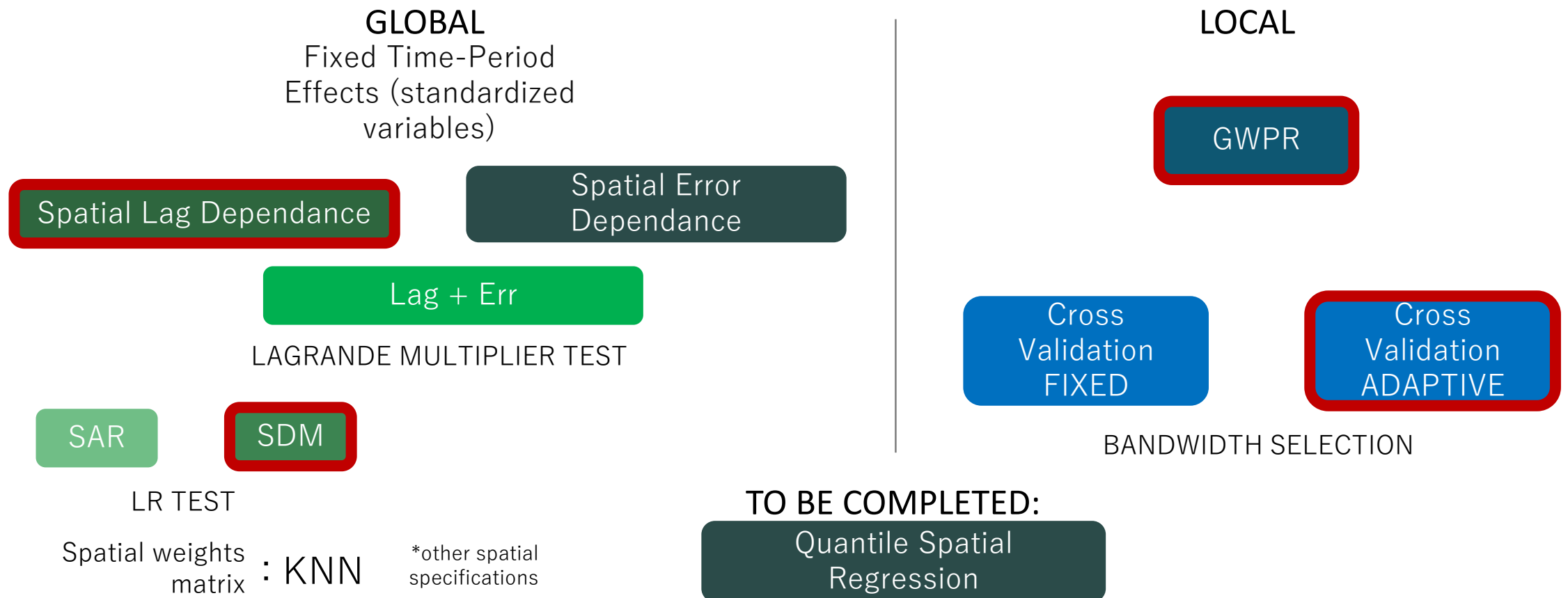
Cities

- Distribution
- Spatial Relationships
- Growth
- Continuity
- Hierarchy
- Size
- Accessibility

Model selection: spatially implicit



Model selection: spatial extension



In red the chosen options



Case Study: Greece

Administrative boundaries of the 1033 Greek municipalities; official statistics released by Population Census 1961-2021.

Sources: USGS, ELSTAT, EUROSTAT;
Basemap: ESRI Topo World.

Results: spatially implicit model selection

Table 1: Panel specification.

	Intercept	Rankdl	R ²	Pesaran's CD test
<i>Pooled OLS</i>				
	5.941***(0.013)	-1.633***(0.013)	0.937	328.81***
<i>Fixed Effects</i>				
Spatial	/	-1.320***(0.018)	0.364	391.78***
Time-period	/	-1.633***(0.005)	0.938	61.35***
Spatial + Time-period	/	-1.320***(0.017)	0.383	78.88***
<i>Random Effects</i>				
Spatial	5.739***(0.025)	-1.555***(0.009)	0.782	344.38***
Time-period	5.941***(0.016)	-1.633***(0.009)	0.783	72.56***
Spatial + Time-period	5.728***(0.027)	-1.550***(0.005)	0.938	66.09***
Hausman Test	Fixed vs Random Effects: 225.61***			

Table 2: Variable selection

Time-period FE		
	Var log native	Var log standardised
Rankdl	-1.633***(0.005)	-0.972***(0.003)
R ²	0.938	0.945
Pesaran's CD test	61.35***	36.14***

Results: spatial extension

Table 3: Spatial component specification.

LM test	OLS vs SAR	OLS vs SEM
	LMlag: 32.553***	LMerr: 1.396
	<i>SAR</i>	<i>SDM</i>
Rankdl	-0.969*** (0.003)	-0.969*** (0.003)
ρ	0.028*** (0.005)	-0.039** (0.019)
WRankdl	-	-0.072*** (0.020)
LogLik	226.98	232.92
R ² _{pseudo}	0.945	0.946
LR test	SAR vs SDM LR: 11.892***	

Table 4: Local model – Bandwidth selection.

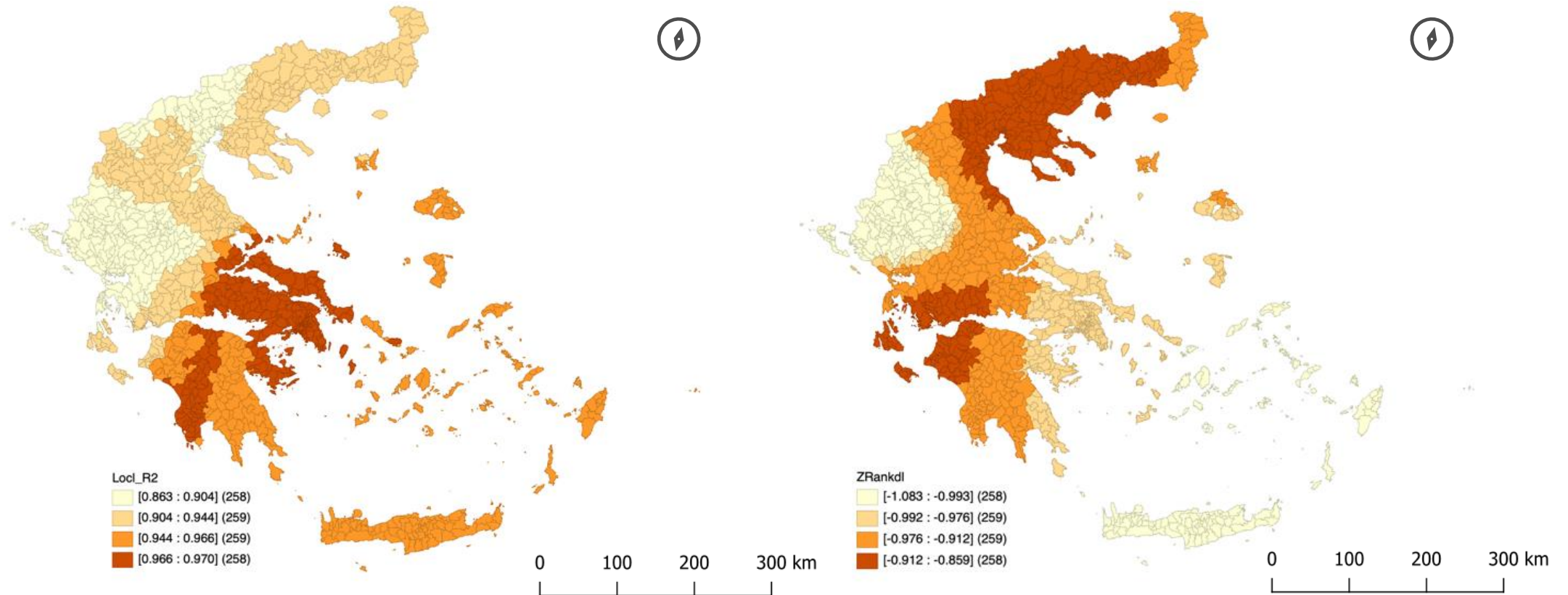
	GWPR			
	CV Fixed		CV adaptive	
	Rankdl	R ²	Rankdl	R ²
Min	-0.9950	0.9445	-1.0833	0.8633
Q ₁	-0.9775	0.9447	-0.9923	0.9044
Median	-0.9731	0.9448	-0.9760	0.9441
Q ₃	-0.9673	0.9450	-0.9116	0.9658
Max	-0.9354	0.9654	-0.8590	0.9701
Mean	-0.9728	0.9466	-0.9612	0.9339
sd	0.0086	0.0053	0.0480	0.0351

Table 5: Model comparison.

	Panel	GWPR	
		CV F	CV A
R ²	0.9447	0.9449	0.9495
AIC	-405.03	-416.220	-1045.386
BIC	-343.05	-354.236	-983.402

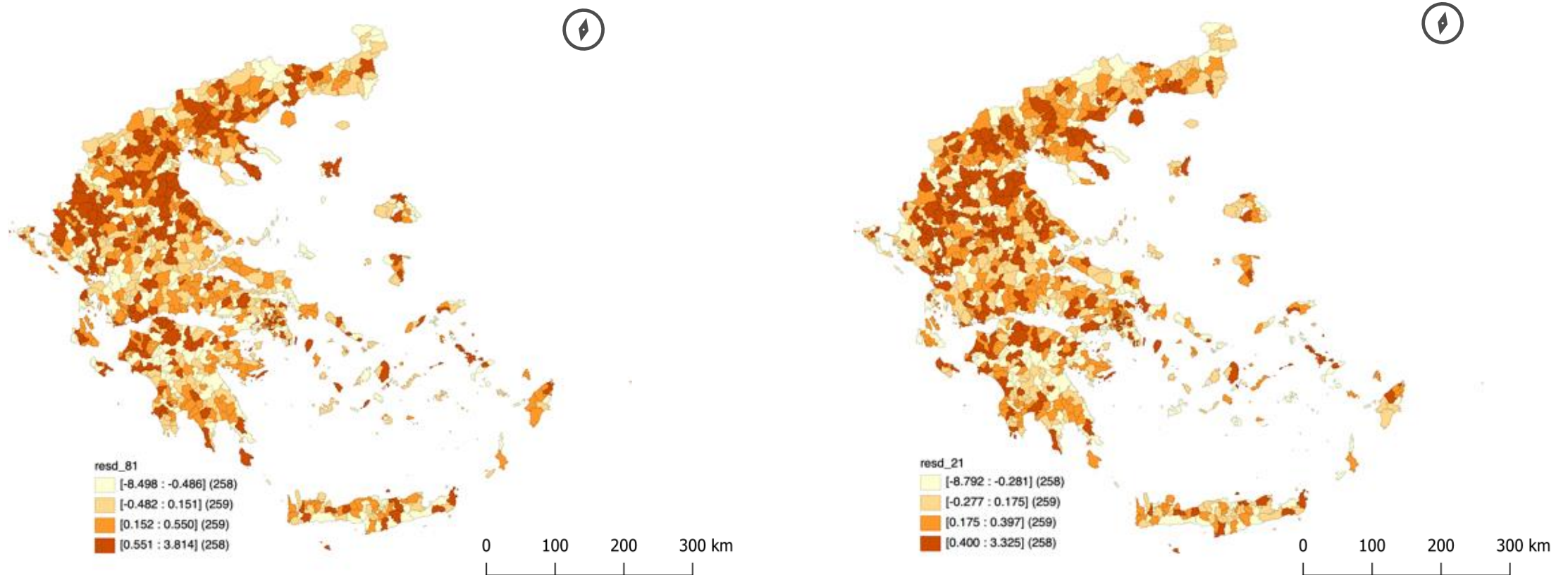
Local Panel Coefficients

Fig. 1: Quartile distribution: R^2 (left); Rankdl/slope (right).



Local Panel Residuals

Fig. 2: Quartile distribution: standardized residuals; 1961 (left), 2021 (right).



Conclusions

- Fitting data
- Governing heterogeneity of spatial data
- Settlement evidence for Zipf law