

**EFFECTS OF VARIOUS SOCIO-ECONOMIC  
INDICATORS ON THE SPATIAL DISTRIBUTION OF  
AVERAGE INCOME IN HELSINKI REGION.**

**BY: OYEDAYO OYELOWO**

**STUDENT NUMBER : 014717208**

# Variable Names:

HR\_KTU - Average income of inhabitants, 2014 (HR). ----- RESPONSE VARIABLE

HE\_KIKA: Average age of inhabitants, 2015 (HE) ----- PREDICTORS

HR\_OVY: Accumulated purchasing power of inhabitants, 2014 (HR)

KO\_KOUL: With education, total, 2014 (KO)

PT\_TYOTT: Unemployed, 2014 (PT)

TP\_PALV\_GU : Services, 2014 (TP)

TP\_O\_JULK : Public administration and defence; compulsory social security, 2014 (TP)

KO\_YL\_KORK : Academic degree - Higher level university degree, 2014 (KO)

KO\_AMMAT : Vocational diploma, 2014 (KO)

HE\_MIEHET : Males, 2015 (HE)

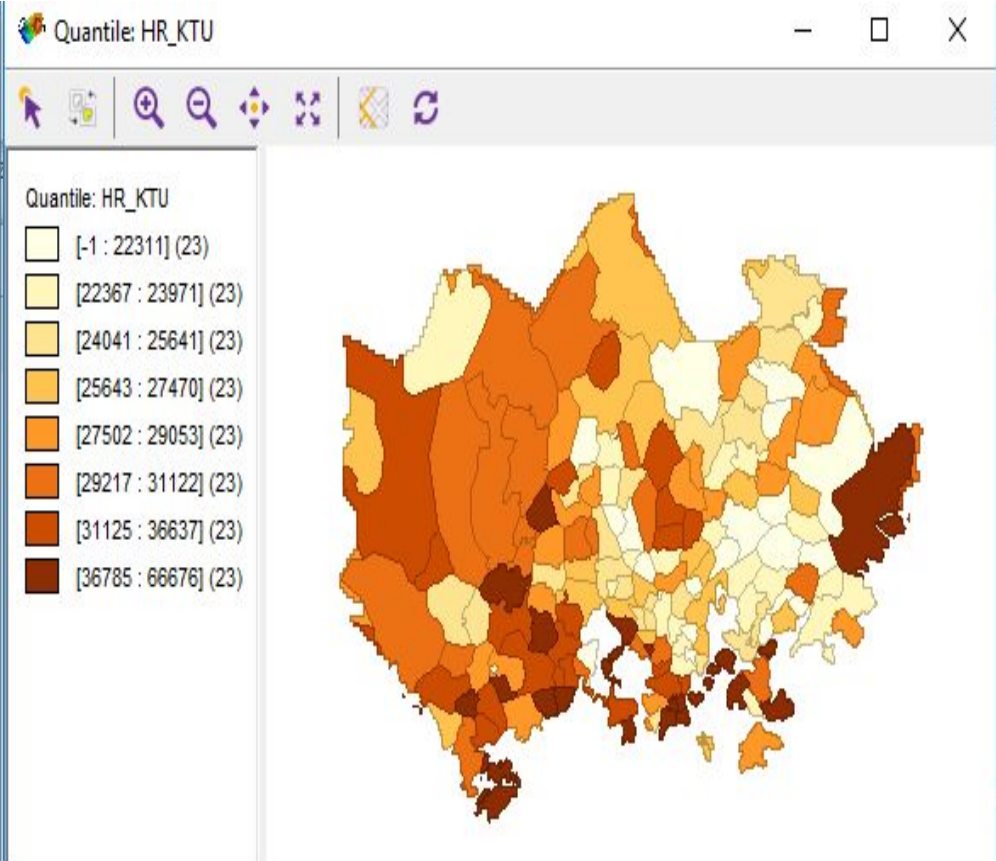
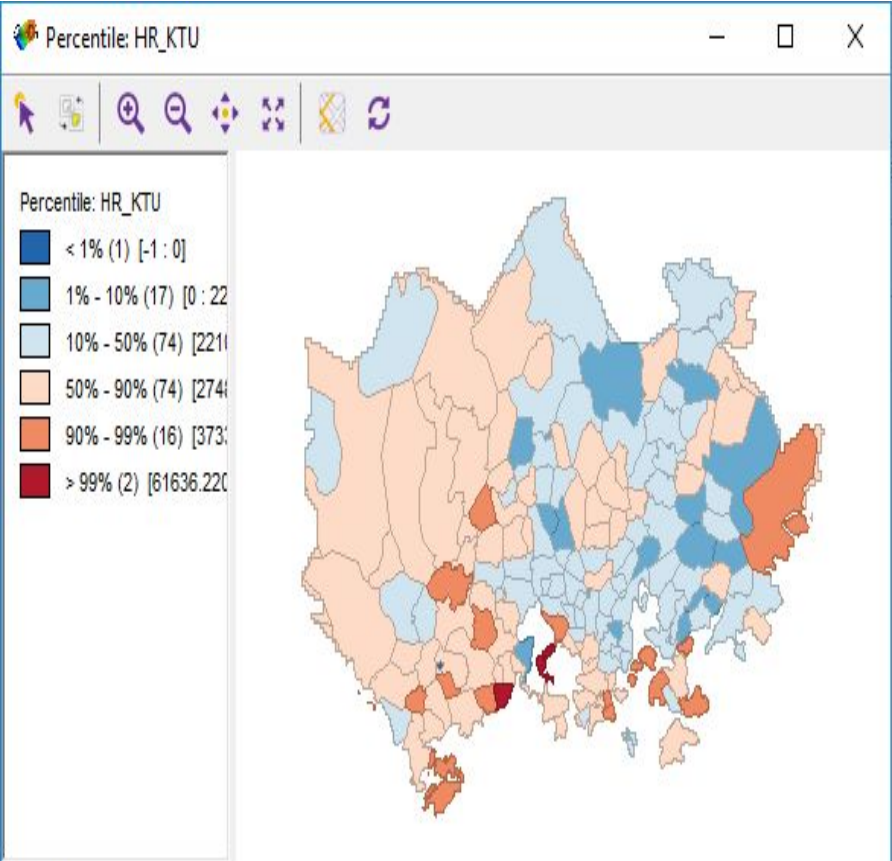
KO\_PERUS: Basic level studies, 2014 (KO)

# Research Questions

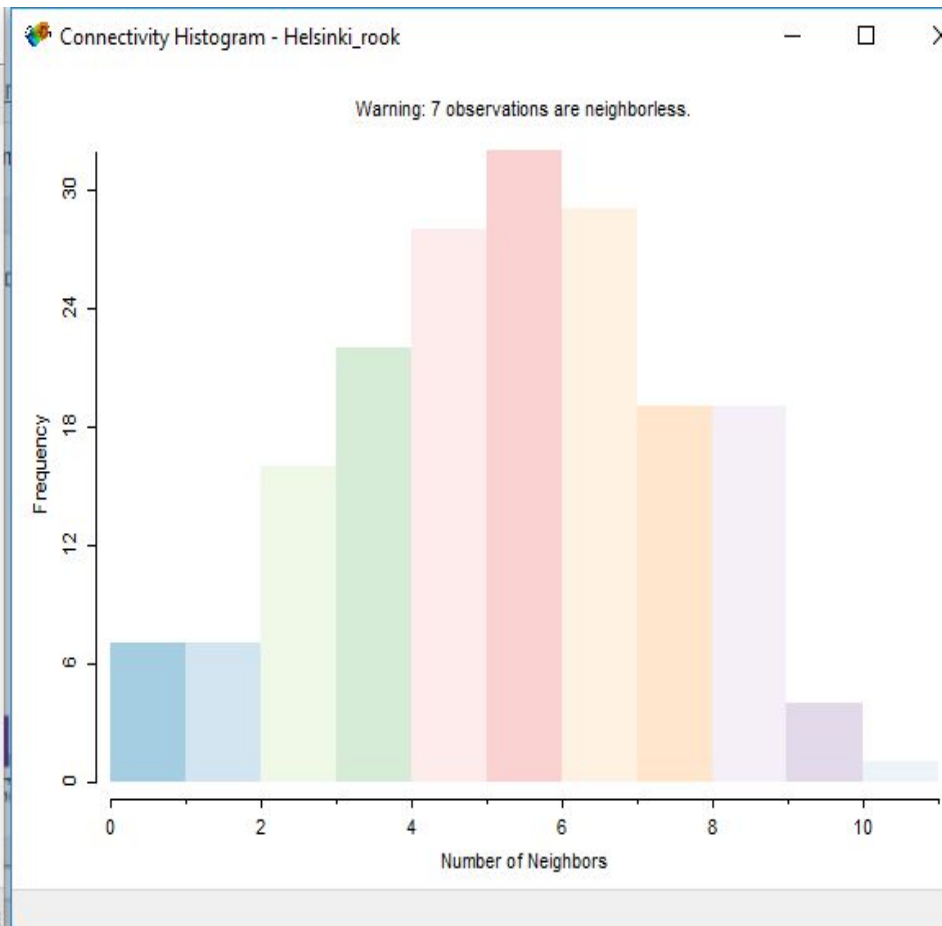
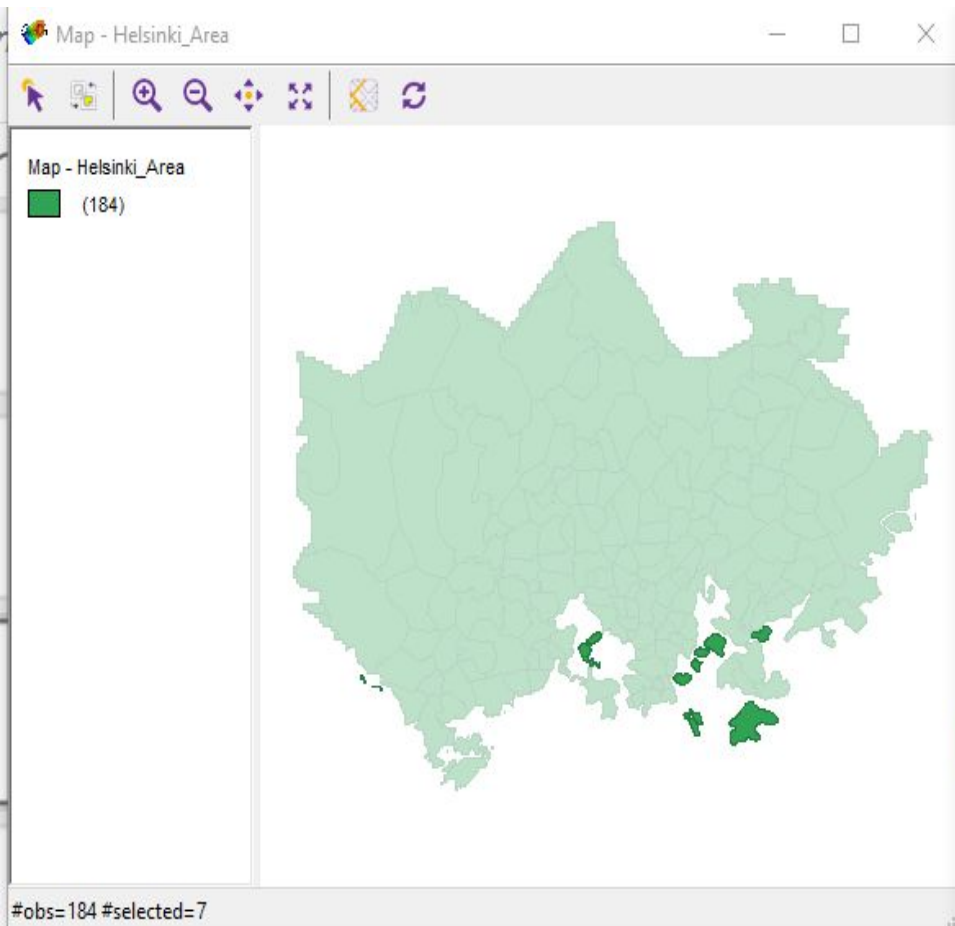
- Does Average income vary spatially in Helsinki region?
- If so, how much does it vary?
- What are the socioeconomic variables affecting average income in the region.
- How do their effects vary across the region?




# Average Income of Inhabitants, 2014

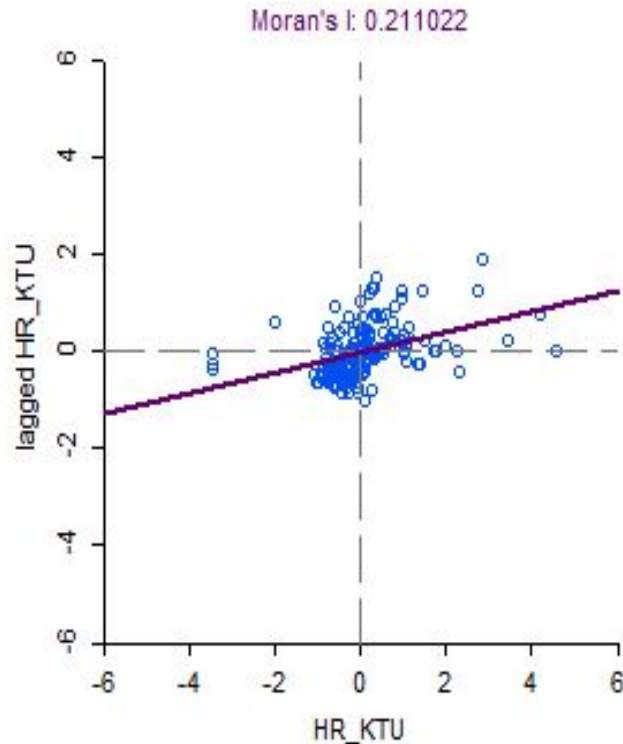


# Queen Neighbourhood

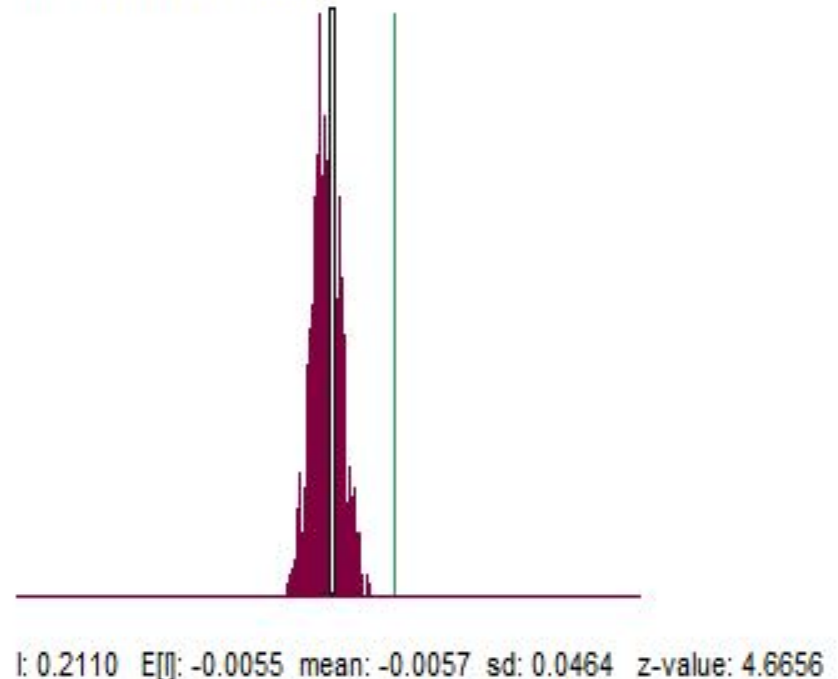


# The Spatial Autocorrelation: Global Moran's I

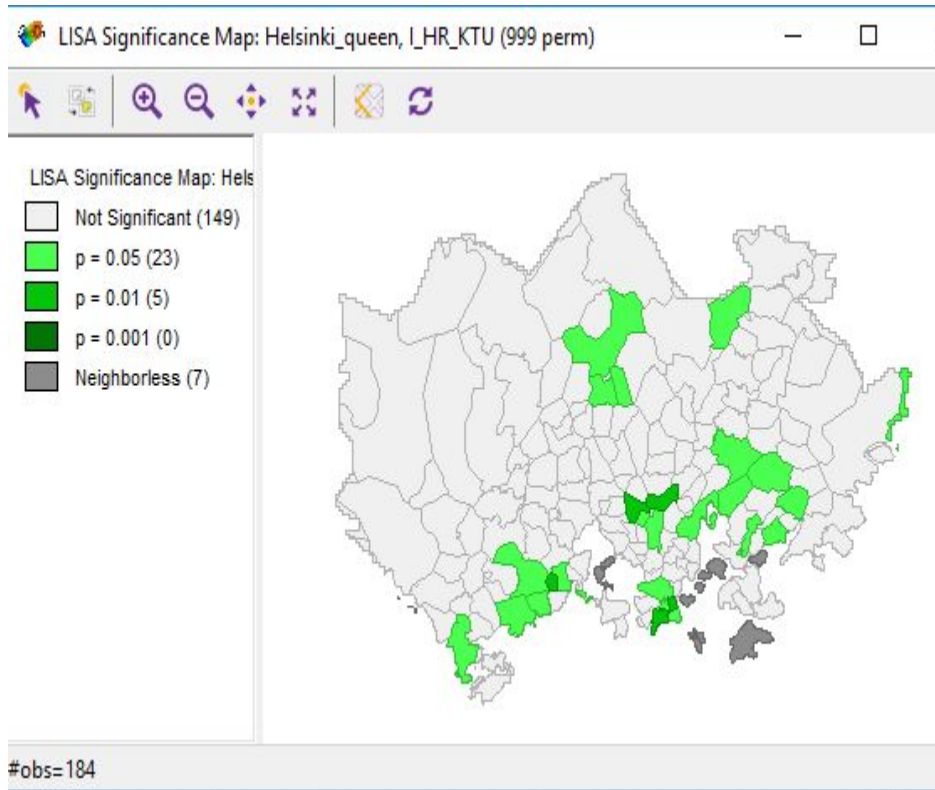
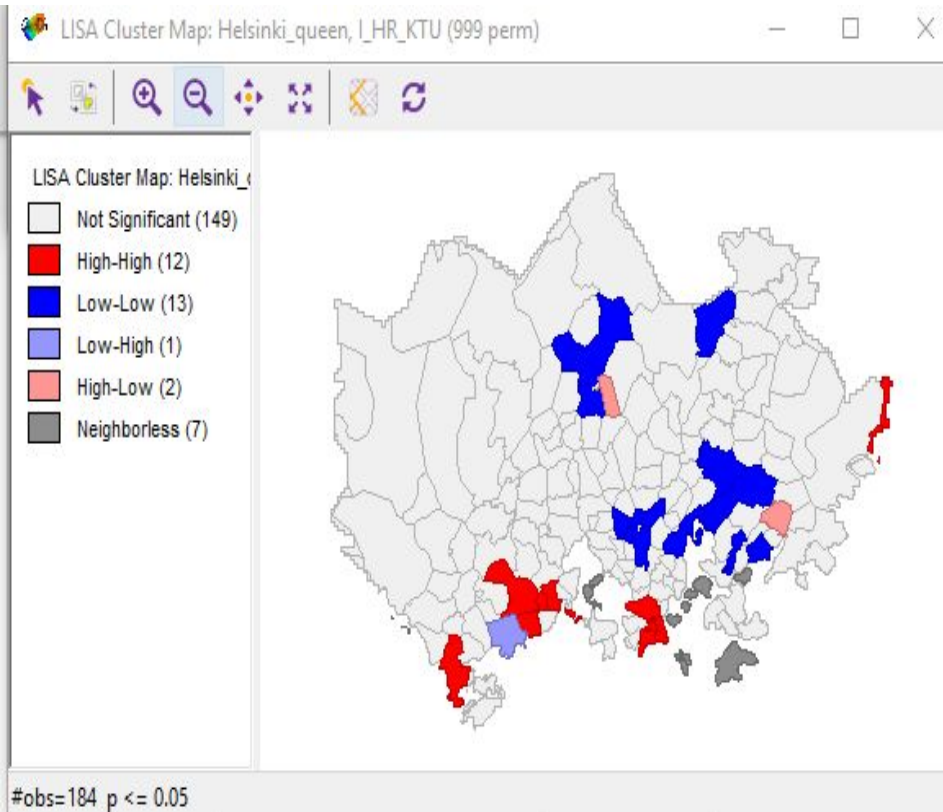
 Moran's I (Helsinki\_queen): HR\_KTU



permutations: 999  
pseudo p-value: 0.001000



# Spatial Autocorrelation





# Regression Report



>>02/21/18 18:02:42

## REGRESSION

### SUMMARY OF OUTPUT: ORDINARY LEAST SQUARES ESTIMATION

Data set	:	Helsinki_Area		
Dependent Variable	:	HR_KTU	Number of Observations:	184
Mean dependent var	:	28574.5	Number of Variables	11
S.D. dependent var	:	8334.06	Degrees of Freedom	173
R-squared	:	0.688250	F-statistic	38.1932
Adjusted R-squared	:	0.670230	Prob(F-statistic)	9.80587e-039
Sum squared residual	:	3.98417e+009	Log likelihood	-1815.03
Sigma-square	:	2.30299e+007	Akaike info criterion	3652.05
S.E. of regression	:	4798.94	Schwarz criterion	3687.41
Sigma-square ML	:	2.16531e+007		
S.E of regression ML	:	4653.29		

Variable	Coefficient	Std.Error	t-Statistic	Probability
CONSTANT	4346.09	2534.63	1.71468	0.08819
KO_KOUL	-5.36512	1.44481	-3.71337	0.00028
HR_OVY	0.000249703	2.59412e-005	9.62573	0.00000
HE_KIKA	646.674	65.4462	9.88101	0.00000
PT_TYOTT	16.8955	6.12208	2.75977	0.00641
TP_PALV_GU	-0.298818	0.122209	-2.44514	0.01548
TP_O_JULK	2.2154	0.852248	2.59948	0.01014
KO_YL_KORK	-11.6573	3.60801	-3.23095	0.00148



# Regression Report

Variable	Coefficient	Std.Error	t-Statistic	Probability
CONSTANT	4346.09	2534.63	1.71468	0.08819
KO_KOUL	-5.36512	1.44481	-3.71337	0.00028
HR_OVY	0.000249703	2.59412e-005	9.62573	0.00000
HE_KIKA	646.674	65.4462	9.88101	0.00000
PT_TYOTT	16.8955	6.12208	2.75977	0.00641
TP_PALV_GU	-0.298818	0.122209	-2.44514	0.01548
TP_O_JULK	2.2154	0.852248	2.59948	0.01014
KO_YL_KORK	-11.6573	3.60801	-3.23095	0.00148
KO_AMMAT	-8.85584	2.66008	-3.32916	0.00106
HE_MIEHET	5.29272	1.52869	3.46226	0.00067
KO_PERUS	-9.05561	2.18957	-4.13579	0.00006

## REGRESSION DIAGNOSTICS

MULTICOLLINEARITY CONDITION NUMBER 76.038414

## TEST ON NORMALITY OF ERRORS

TEST	DF	VALUE	PROB
Jarque-Bera	2	433.9371	0.00000

## DIAGNOSTICS FOR HETEROSKEDASTICITY

## RANDOM COEFFICIENTS

TEST	DF	VALUE	PROB
Breusch-Pagan test	10	73.6672	0.00000
Koenker-Bassett test	10	17.0145	0.07404

## REGRESSION DIAGNOSTICS

MULTICOLLINEARITY CONDITION NUMBER 76.038414

## TEST ON NORMALITY OF ERRORS

TEST	DF	VALUE	PROB
Jarque-Bera	2	433.9371	0.00000

## DIAGNOSTICS FOR HETEROSKEDASTICITY

## RANDOM COEFFICIENTS

TEST	DF	VALUE	PROB
Breusch-Pagan test	10	73.6672	0.00000
Koenker-Bassett test	10	17.0145	0.07404

## DIAGNOSTICS FOR SPATIAL DEPENDENCE

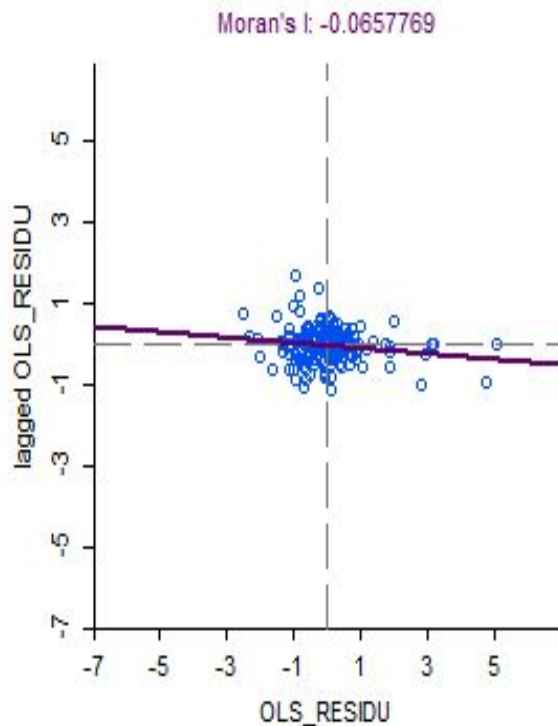
FOR WEIGHT MATRIX : Helsinki\_queen

(row-standardized weights)

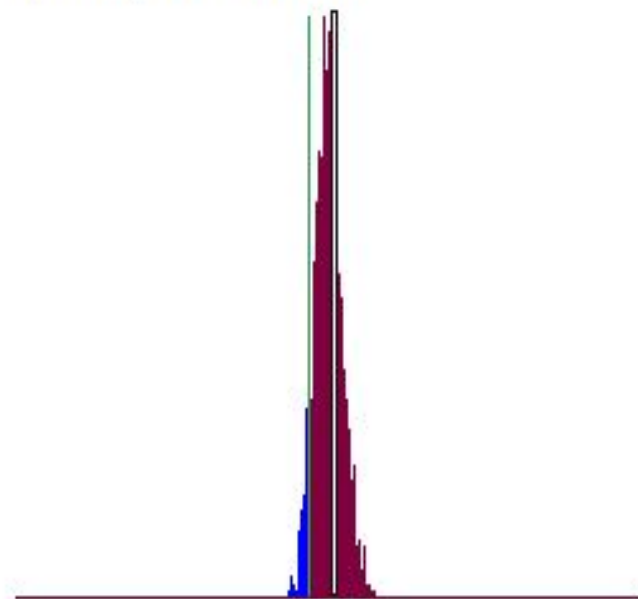
TEST	MI/DF	VALUE	PROB
Moran's I (error)	-0.0658	-1.0330	0.30163
Lagrange Multiplier (lag)	1	9.4458	0.00212
Robust LM (lag)	1	7.6527	0.00567
Lagrange Multiplier (error)	1	1.7933	0.18052
Robust LM (error)	1	0.0001	0.99132
Lagrange Multiplier (SARMA)	2	9.4460	0.00889

# Spatial Autocorrelation of error

Moran's I (Helsinki\_queen): OLS\_RESIDU

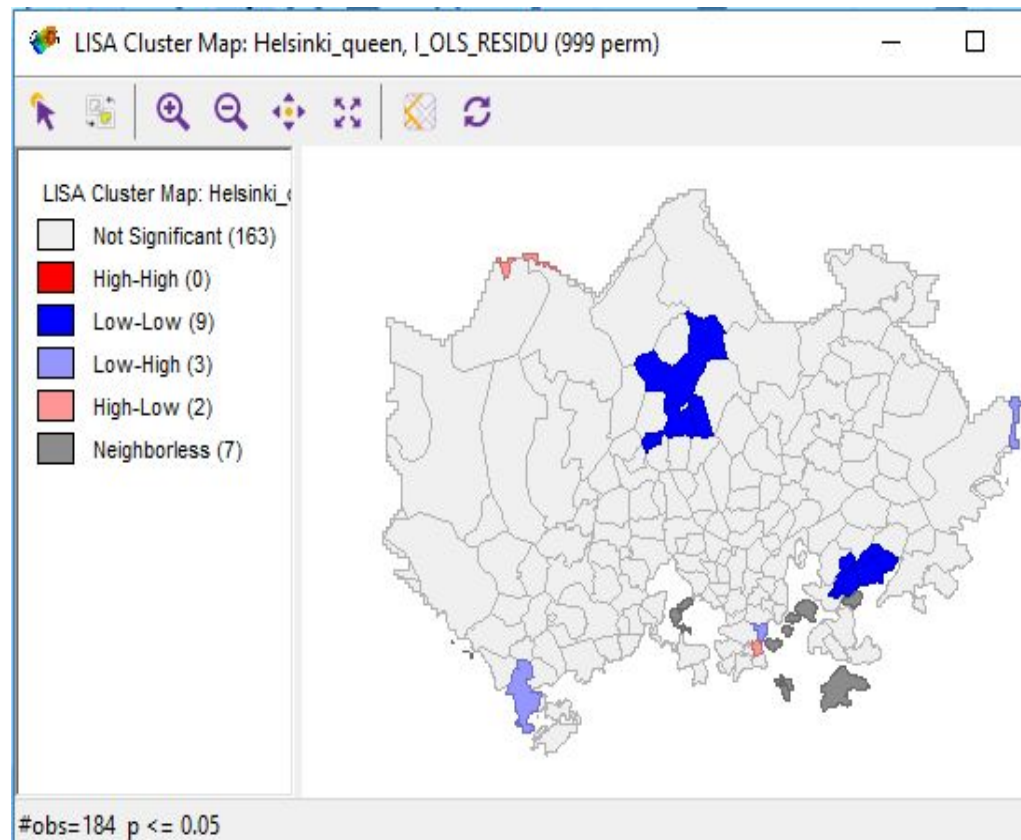
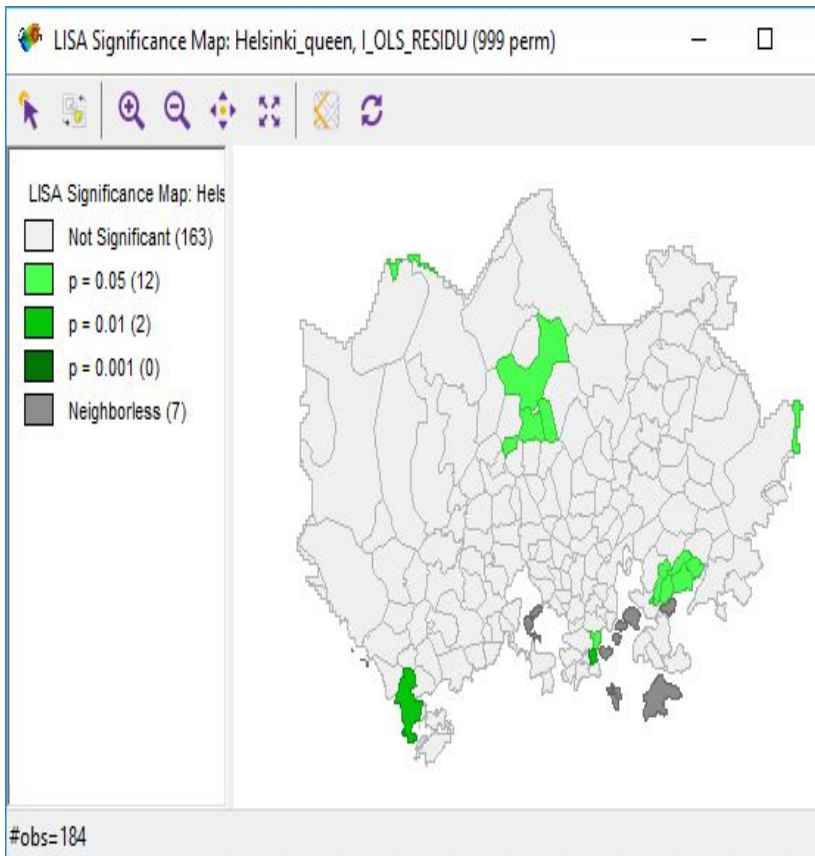


permutations: 999  
pseudo p-value: 0.097000



I: -0.0658 E[I]: -0.0055 mean: -0.0067 sd: 0.0448 z-value: -1.3190

# Cluster of the Residuals



# Report: Spatial Lag Model

>>02/21/18 18:40:06

## REGRESSION

### SUMMARY OF OUTPUT: SPATIAL LAG MODEL - MAXIMUM LIKELIHOOD ESTIMATION

Data set : Helsinki\_Area  
Spatial Weight : Helsinki\_queen  
Dependent Variable : HR\_KTU Number of Observations: 184  
Mean dependent var : 28574.5 Number of Variables : 12  
S.D. dependent var : 8334.06 Degrees of Freedom : 172  
Lag coeff. (Rho) : -0.161727  
  
R-squared : 0.707028 Log likelihood : -1809.77  
Sq. Correlation : - Akaike info criterion : 3643.53  
Sigma-square : 2.03488e+007 Schwarz criterion : 3682.11  
S.E of regression : 4510.97

## REGRESSION DIAGNOSTICS

### DIAGNOSTICS FOR HETEROSKEDASTICITY

#### RANDOM COEFFICIENTS

TEST	DF	VALUE	PROB
Breusch-Pagan test	10	72.2687	0.00000

### DIAGNOSTICS FOR SPATIAL DEPENDENCE

SPATIAL LAG DEPENDENCE FOR WEIGHT MATRIX : Helsinki\_queen

TEST	DF	VALUE	PROB
Likelihood Ratio Test	1	10.5192	0.00118

## Regression Report



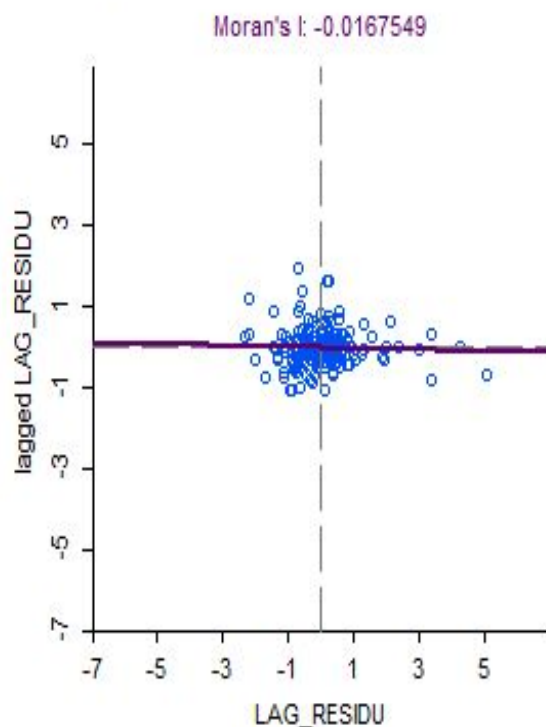
Data set : Helsinki\_Area  
Spatial Weight : Helsinki\_queen  
Dependent Variable : HR\_KTU Number of Observations: 184  
Mean dependent var : 28574.5 Number of Variables : 12  
S.D. dependent var : 8334.06 Degrees of Freedom : 172  
Lag coeff. (Rho) : -0.161727  
  
R-squared : 0.707028 Log likelihood : -1809.77  
Sq. Correlation : - Akaike info criterion : 3643.53  
Sigma-square : 2.03488e+007 Schwarz criterion : 3682.11  
S.E of regression : 4510.97

Variable	Coefficient	Std.Error	z-value	Probability
W_HR_KTU	-0.161727	0.0483448	-3.34528	0.00082
CONSTANT	8173.11	2672.99	3.05766	0.00223
KO_KOUL	-5.86134	1.36217	-4.30294	0.00002
HR_OVY	0.00025318	2.43848e-005	10.3827	0.00000
HE_KIKA	651.037	61.52	10.5825	0.00000
PT_TYOTT	17.2476	5.7555	2.99672	0.00273
TP_PALV_GU	-0.27899	0.11509	-2.4241	0.01535
TP_O_JULK	2.06764	0.803007	2.57488	0.01003
KO_YL_KORK	-11.1736	3.39438	-3.29178	0.00100
KO_AMMAT	-8.93677	2.50054	-3.57394	0.00035
HE_MIEHET	5.88976	1.44263	4.08264	0.00004
KO_PERUS	-9.44248	2.06069	-4.58219	0.00000

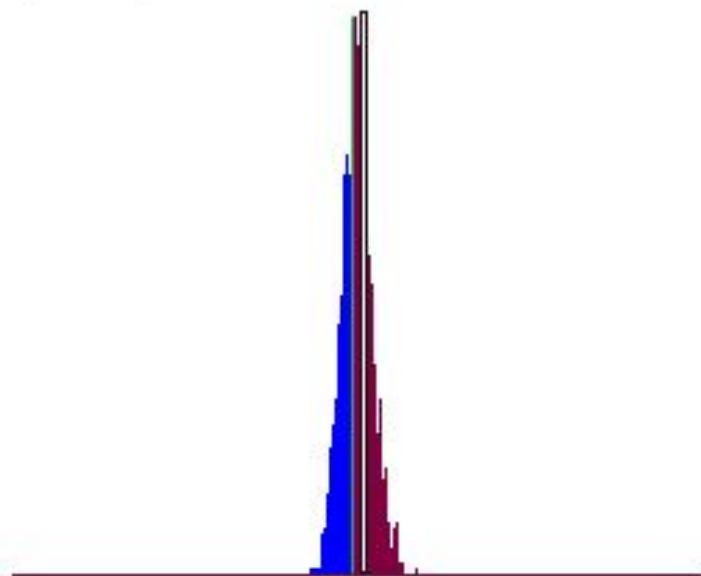


# Spatial Lag Residual

Moran's I (Helsinki\_queen): LAG\_RESIDU



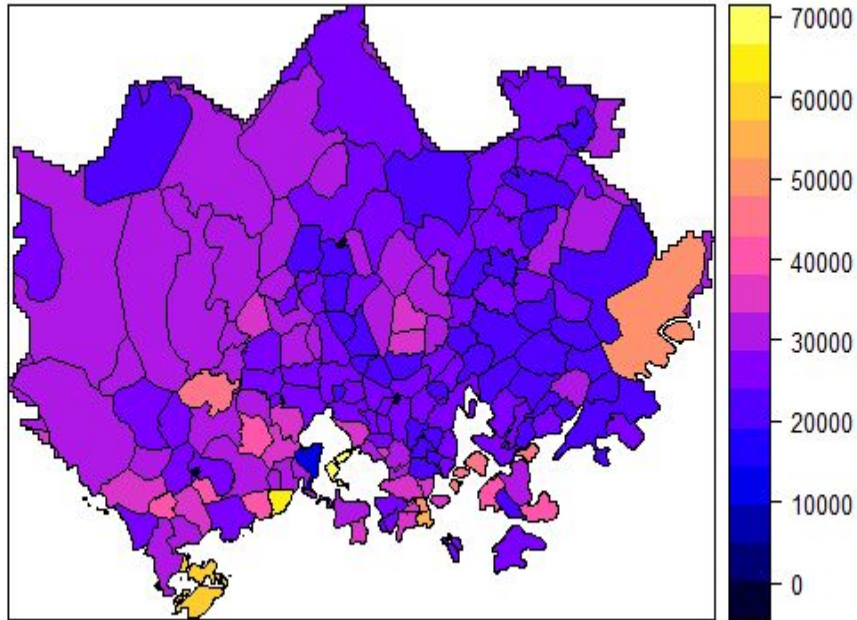
permutations: 999  
pseudo p-value: 0.418000



I: -0.0168 E[I]: -0.0055 mean: -0.0071 sd: 0.0446 z-value: -0.2162

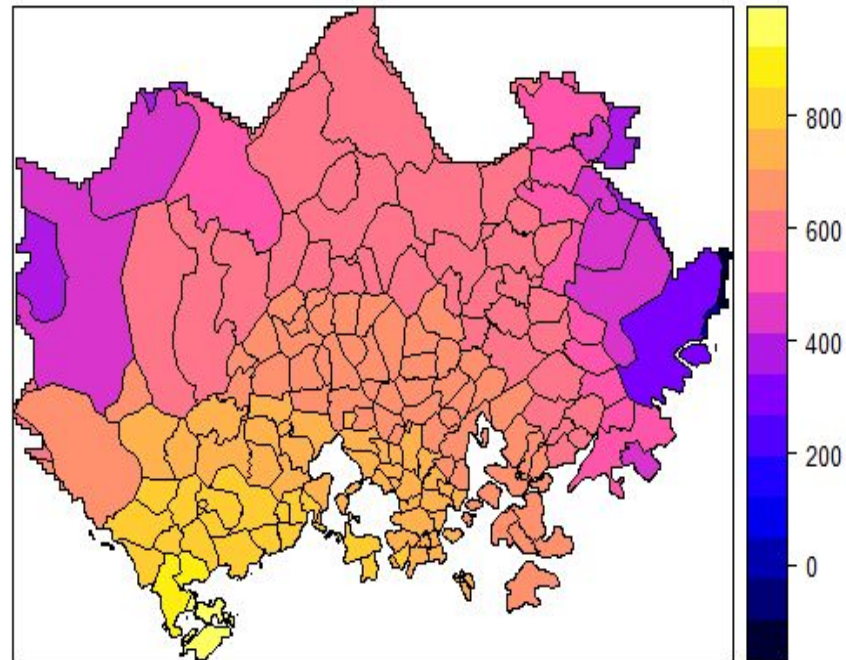
# Geographically Weighted Regression

Helsinki,



Average income of inhabitants

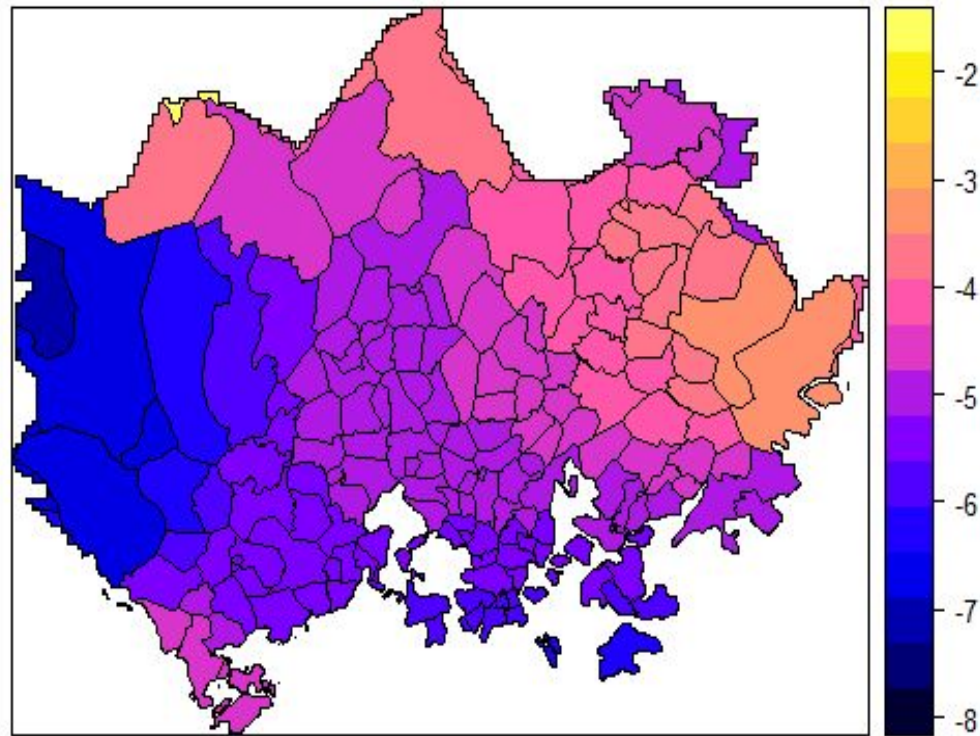
Average age of inhabitants



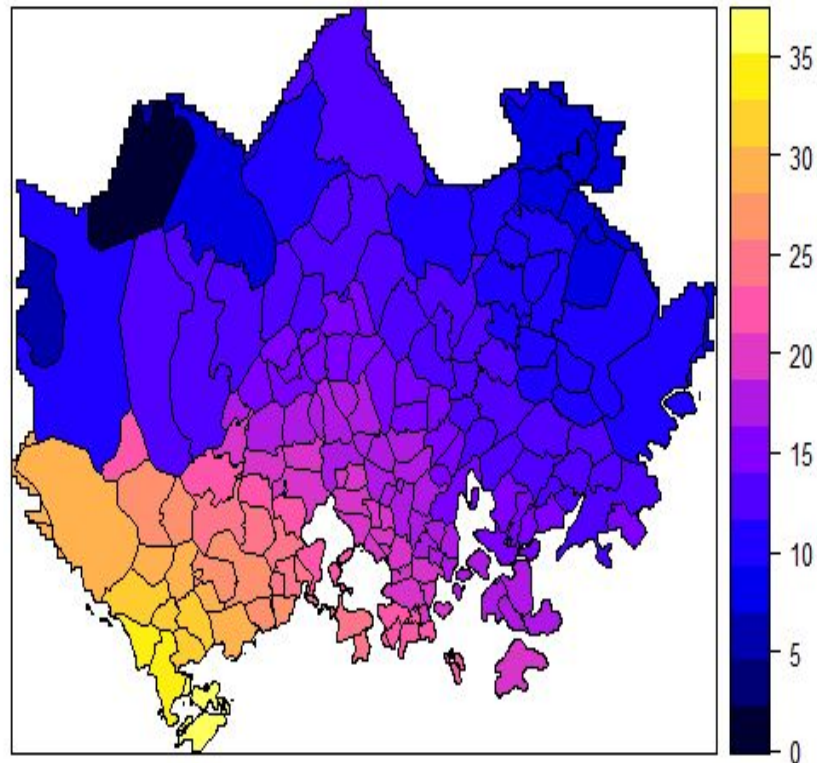


# Geographically Weighted Regression

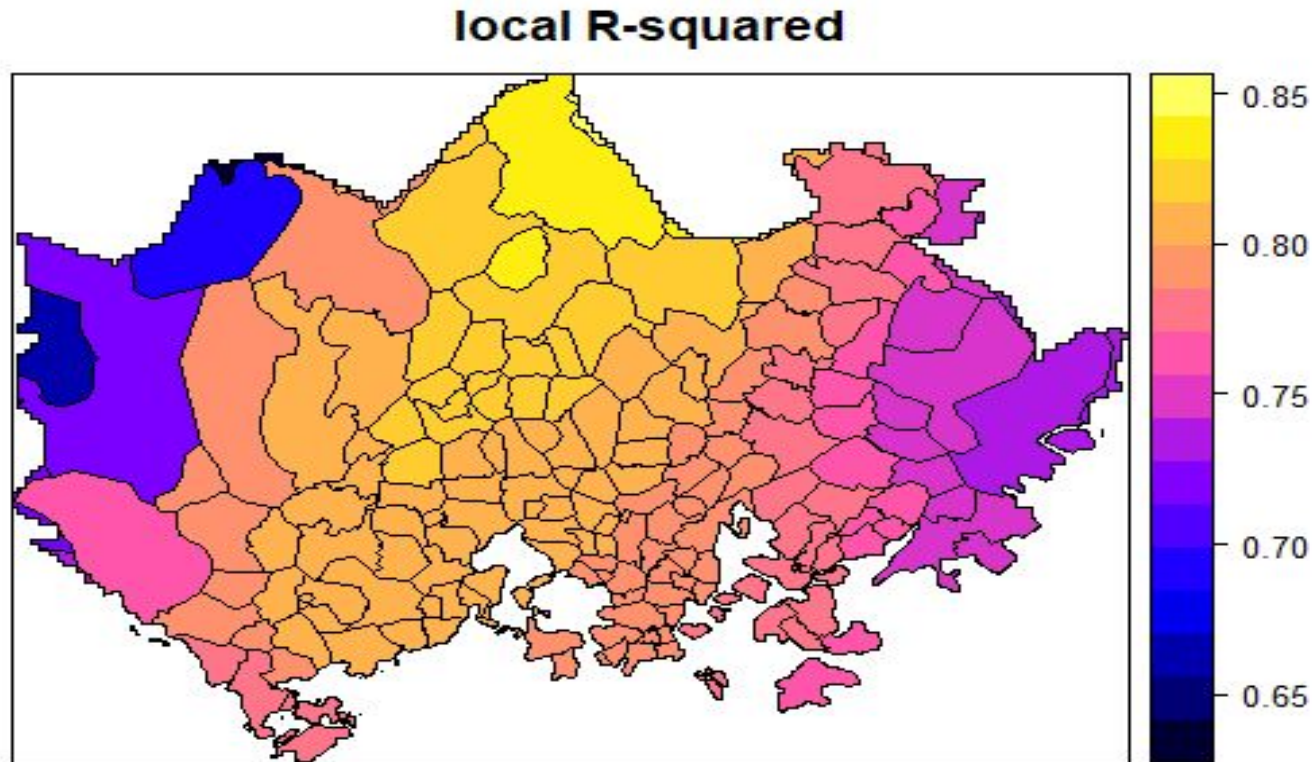
people with at least an upper secondary qualification



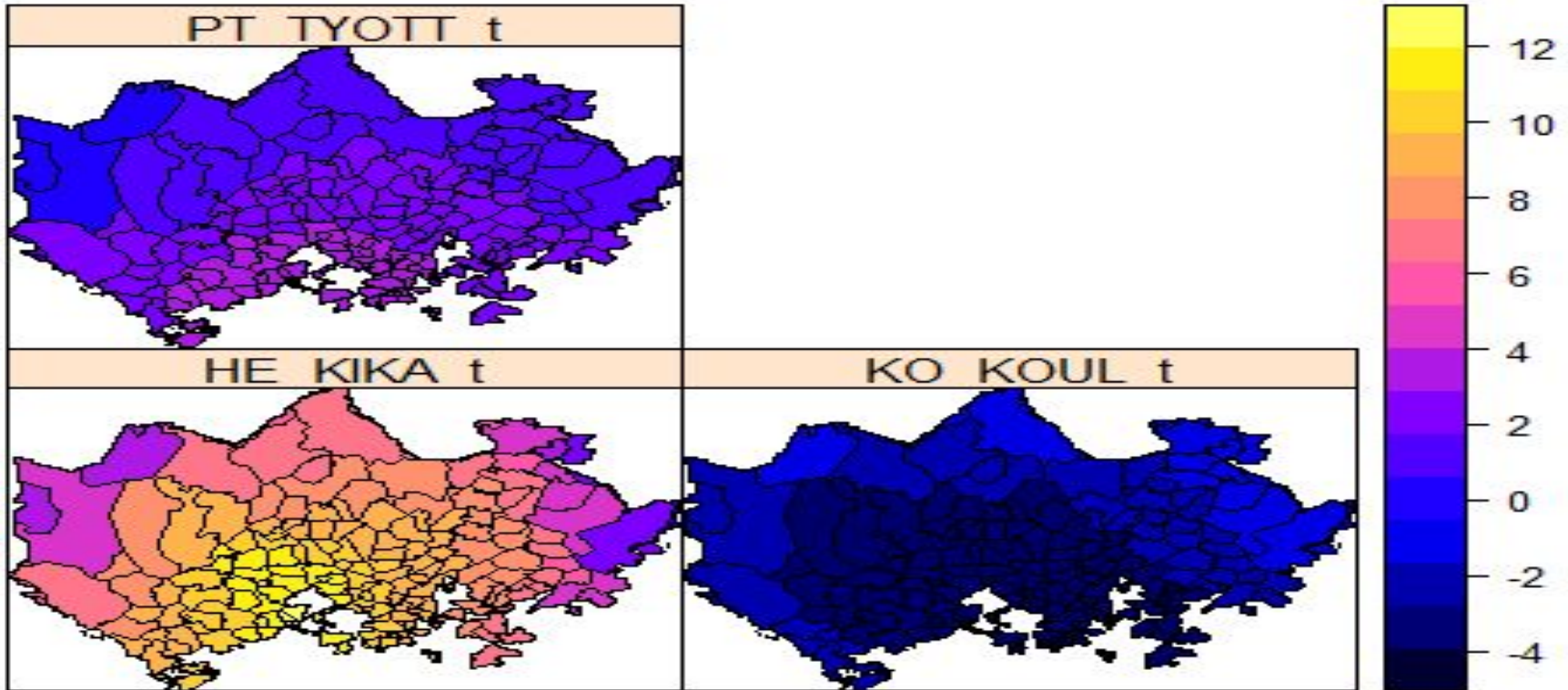
Unemployed labour force



# Geographically Weighted Regression



# Geographically Weighted Regression



---

# Conclusion:

- Coefficient of determination : 70%
- Income is generally higher in the west than the east..
- Effects of education, age and unemployment on spatial distribution of average income, are highest at the centre compared to the outer regions.
- Average age and Unemployed labour force have more impacts on average income in the southwestern area
- Education has more impact in the northeastern part.



**KITTOS!!**