

Accounting uncertainty for spatial modeling of greenhouse gas emissions in the residential sector: fuel combustion and heat production

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Agenda

- ▶ Introduction
- ▶ Methodology
- ▶ Inventory results: Poland and Ukraine
- ▶ Validation of approach
- ▶ Conclusions

Essence of the approach

Statistical data

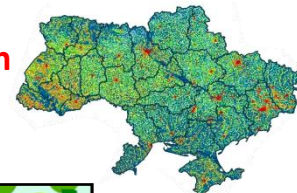
Parameters

Other information

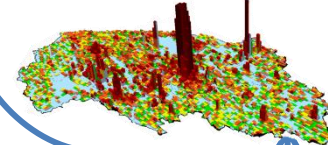
Disaggregation algorithms and data processing

$$F_{typ,k}^R = \frac{H_{typ,i}^R}{\sum_{i=1}^{I_1} Q(p) \cdot H_{Rur,i}^R + \sum_{p \in \{Urb, CO\}} \sum_{i=1}^{I_2} Q(p) \cdot H_{Urb,i}^R}$$

Map of emission sources



Visualization of results



All settlements All regions

region

country

Mathematical model:

$$E_{Res}^G(\delta) = \sum_{s \in S_{Rur}} \left(\sum_{i=1}^{I_1} M_i^O F_{i,Rur}^R EF_{Res,i}^G + \sum_{j=1}^{I_2} M_j^O F_{j,Rur}^R EF_{Res,j}^G \right)$$

fossil fuels, greenhouse gases, net calorific values....

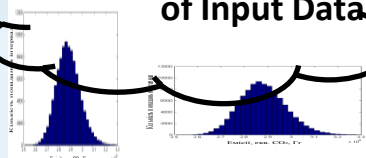
Uncertainty analysis

$$f(x; \mu, \sigma) = \frac{1}{x\sigma\sqrt{2\pi}} \exp\left(-\frac{(\ln(x) - \mu)^2}{2\sigma^2}\right), x > 0$$

Monte-Carlo method, 95%,

Emissions CO₂, CH₄, N₂O: ???
Uncertainties: ???

Uncertainty of Input Data



Database of geo-referenced data

ID	Name	Y	F	C_2010
1	Білоцерківська ТЕЦ	30,1866	49,7968	120
2	Буштинська ТЕС	24,6640	49,2086	2000
3	Білоцерківська ТЕС	30,1866	49,7968	120
4	Дарницька ТЕЦ (Київська ТЕЦ-4, «Укр-К	30,643	50,4473	180
5	Дніпропетровська ТЕЦ	34,6211	48,53	61,6
				65,6534



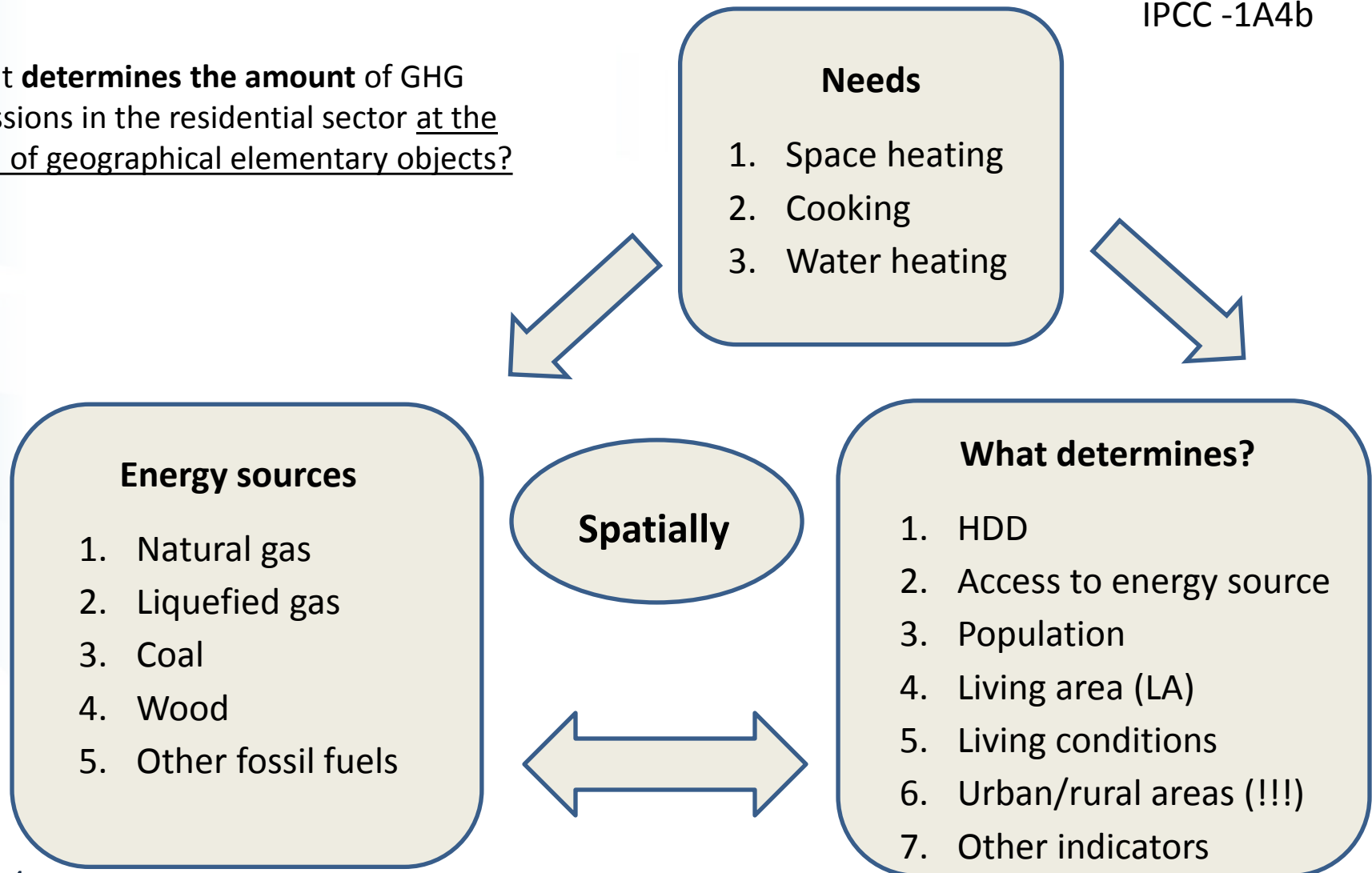
Турция	4625520100	54 900	54 100	53 000	53 000	52 400	51 900	51 300	50 900
Сербия	4625520100	62 100	61 500	60 000	60 000	59 300	58 700	58 100	57 500
Молдова	4625520100	61 900	61 200	60 000	60 000	59 300	58 700	58 100	57 500
Словения	4625520100	50 300	49 700	49 000	48 300	47 600	47 000	46 300	45 700
Грузия	4625520100	70 000	70 000	70 000	70 000	70 000	70 000	70 000	70 000
Словаччина	4625520100	47 800	47 100	46 400	45 700	45 000	44 300	43 600	42 900
Польща	4625520100	123 000	123 000	123 000	123 000	123 000	123 000	123 000	123 000
Румунія	4625520100	52 400	52 000	51 700	51 300	50 900	50 500	50 100	49 700
Болгарія	4625520100	183 000	181 000	180 000	179 000	178 000	177 000	176 000	175 000
Бразил	4625520100	63 900	63 500	63 200	62 900	62 600	62 300	62 000	61 700
Бразил-Бразил	4625520100	61 000	61 000	60 700	60 400	60 100	59 800	59 500	59 200
Велика Британія	4625520100	50 900	50 200	49 500	48 800	48 100	47 400	46 700	46 000
Португалія	4625520100	882 000	882 000	882 000	882 000	882 000	882 000	882 000	882 000

Results of spatial inventory

Introduction: residential sector

IPCC -1A4b

What **determines the amount** of GHG emissions in the residential sector at the level of geographical elementary objects?



Methodology

Spatial inventory of GHG emissions:
households

Algorithm

Step 1: Input data collection



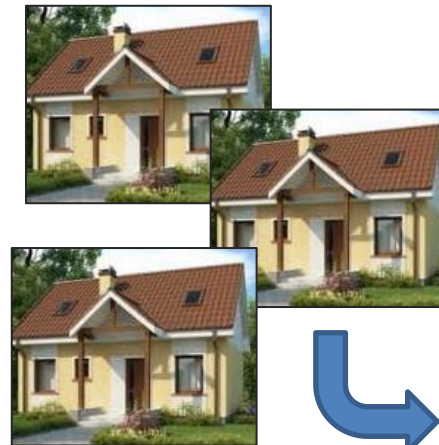
Step 2: Energy demand assessment



Step 3: Fossil fuel disaggregation



Step 4: GHG emission estimation



Step 1:

Input data collection

Energy demand assessment

Fossil fuel disaggregation

GHG emission estimation

Input data

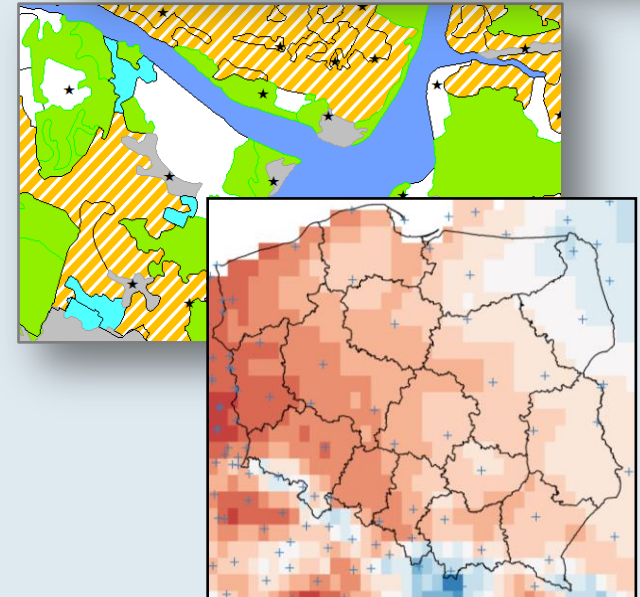
- (1) official statistical information
- (2) country-specific emission factors

(3) digital maps of investigated area

- population density map
raster data on population density
 disaggregated with CLC (Gallego, 2010)
 - a) update of the map (2010 data)
 - b) urban/rural characteristics were added
- Heating-Degree Days map (HDD)

1 Consumption of fossil fuels/Zużycie paliw				
	Kod	Voivodeship	Hard coal	Natural gas
2				
3				
4	kod			
5	02			
6	04			
7	06			
8	08			
9	10			
10	12			

A			B	C
1	Emission factors			
2	EFs [kg/GJ] applied for fuels in the years 1988-2009 for stationary sources in 1A IPCC 2006]			
	Fuels			CO2 E [kg/GJ]
3				
4			fuel	CO2E
5	Hard coal		coal	94
6	natural gas		ngas	55
7	liquid petroleum gas (LPG)		lgas	62
8	Lignite (wielogłazowy)		l	107
9	hard coal briquettes (patent fuels)		coalBr	92
10	brown coal briquettes		brownCoalBr	92



Input data
collection

Step 2:

**Energy
demand
assessment**

Fossil fuel
disaggregation

GHG emission
estimation

Energy demand assessment

$$Q = Q_c + Q_w + Q_h$$

Cooking:

$$Q_c = Q_{c,rs} + Q_{c,agri}$$

The average energy demand for :

- cooking per person,
- feed cooking,
- water heating for drinking and sanitary per 1 head of cattle.

Water heating:

$$Q_w = Q_w^{summ} + Q_w^{wint}$$

Average hot water consumption (norms):

- 48 dm³ – dwelling,
- 35 dm³ - detached house (55°C per person).

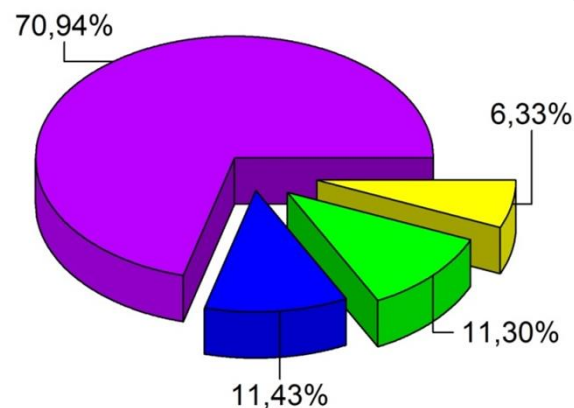
Space heating:

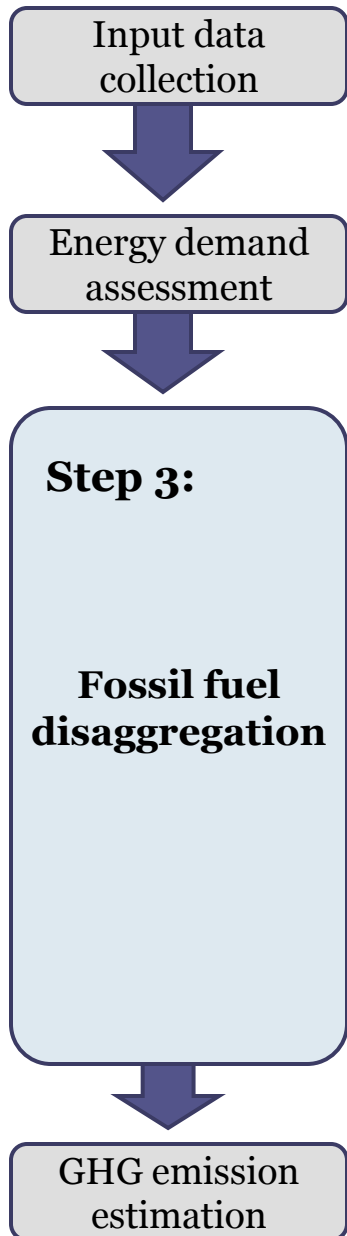
$$Q_h = k_{HDD} \cdot f(Q_{h,sqm}, LA, \varepsilon)$$

- relative change of HDD
- living area (LA) per person
- energy demand per sq m of LA
- characteristics of living area
- efficiency coefficient

Energy demand structure

- cooking for families
- cooking for livestock
- water heating
- space heating





Disaggregation algorithm

$$M_{i,n} = M_{i,R} \cdot F_{type,i}^n, n = \overline{1, N},$$

$M_{i,R}$ - consumed fossil fuel i in region R ,

$type$ - characterizes affiliation of elementary object to urban or rural area,

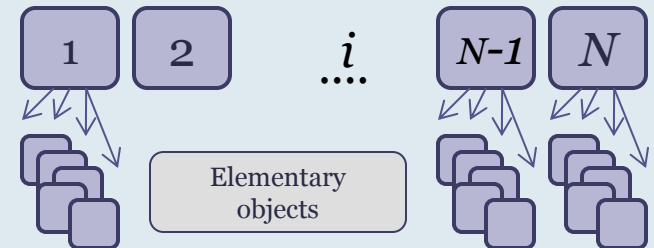
$F_{type,i}^n$ - disaggregation coefficient.

Country (or region) R
fossil fuel i

Statistical data: $M_{i,R}$
fossil fuel consumption

Disaggregation algorithm $F_{type,i}^n$

Regions (or municipalities)



Input data
collection

Energy demand
assessment

Fossil fuel
disaggregation

Step 4:

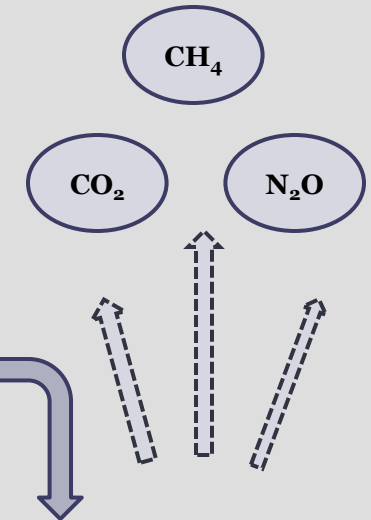
**GHG
emission
estimation**

GHG emission estimation

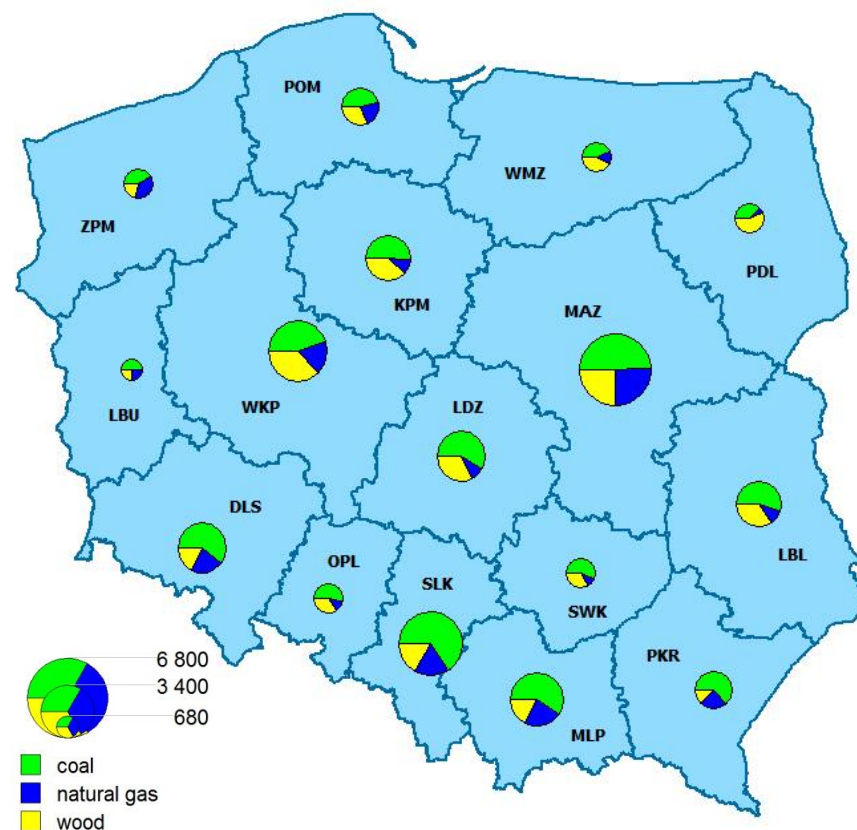
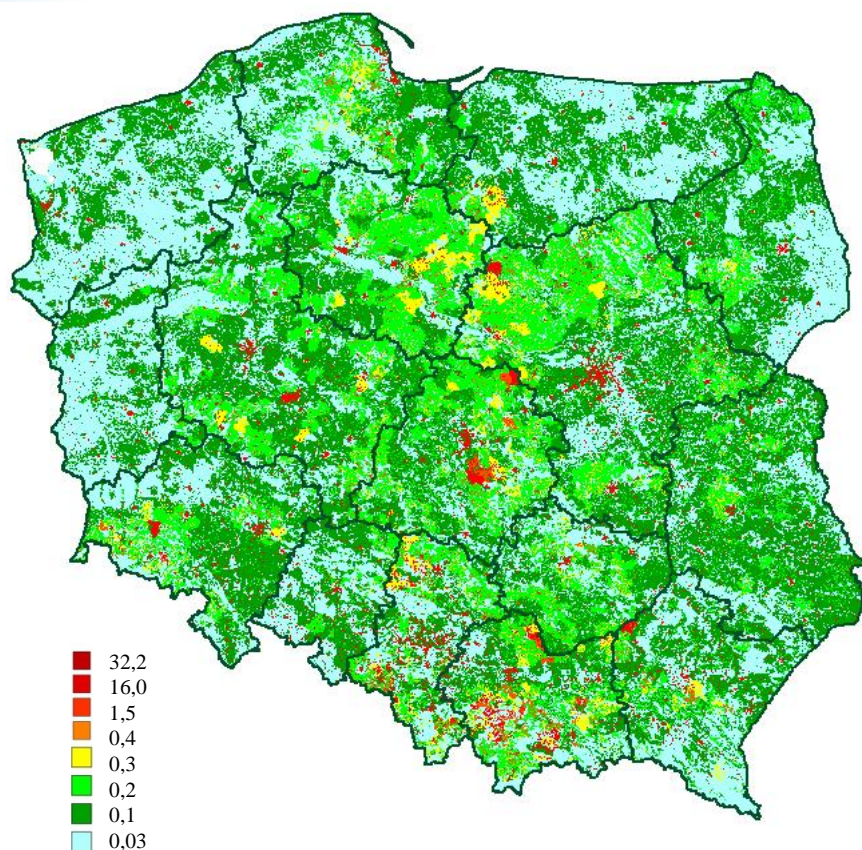
$$E_{i,n}^G = M_{i,n} \cdot EF_{i,n}^G, n = \overline{1, N},$$

$EF_{i,n}^G$ - emission factor of
greenhouse gas G

CO₂-equivalent



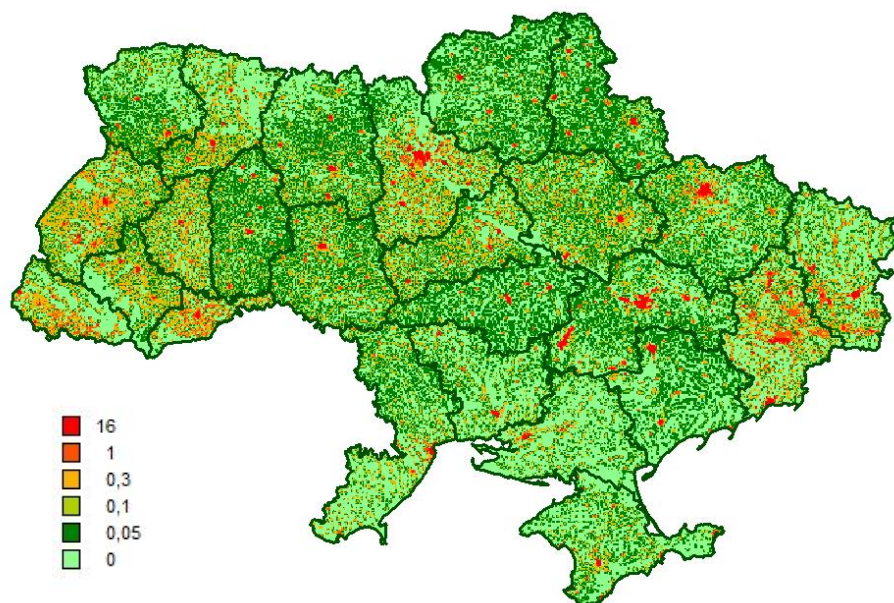
Inventory results: Poland



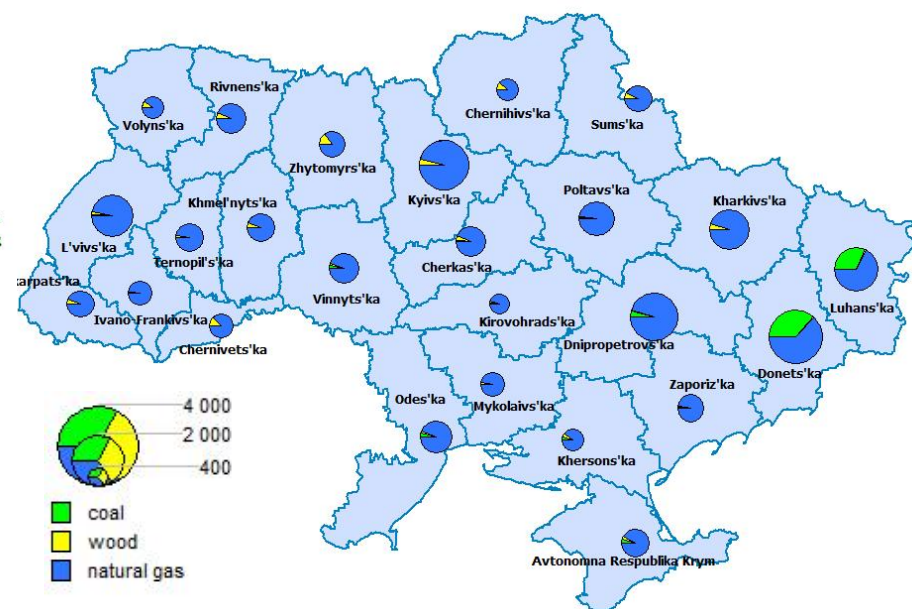
Specific GHG emissions in residential sector (mln kg/sq.km., CO2-eq., Poland, 2010)

Structure of GHG emissions by type of fossil fuel for administrative regions (mln kg, CO2-eq., Ukraine, 2010)

Inventory results: Ukraine

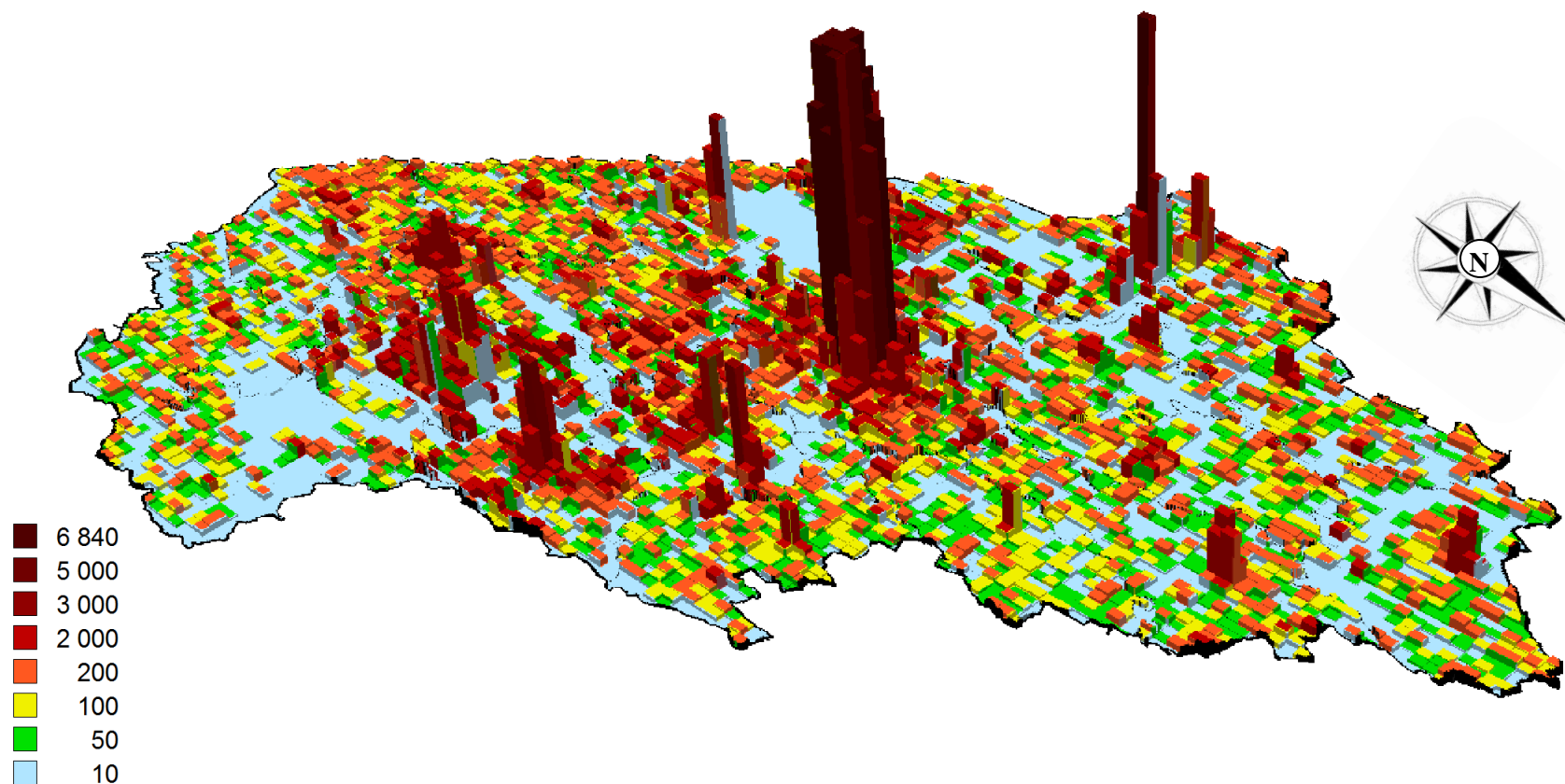


Specific GHG emissions in residential sector
(mln kg/sq.km., CO2-eq., Ukraine, 2010)



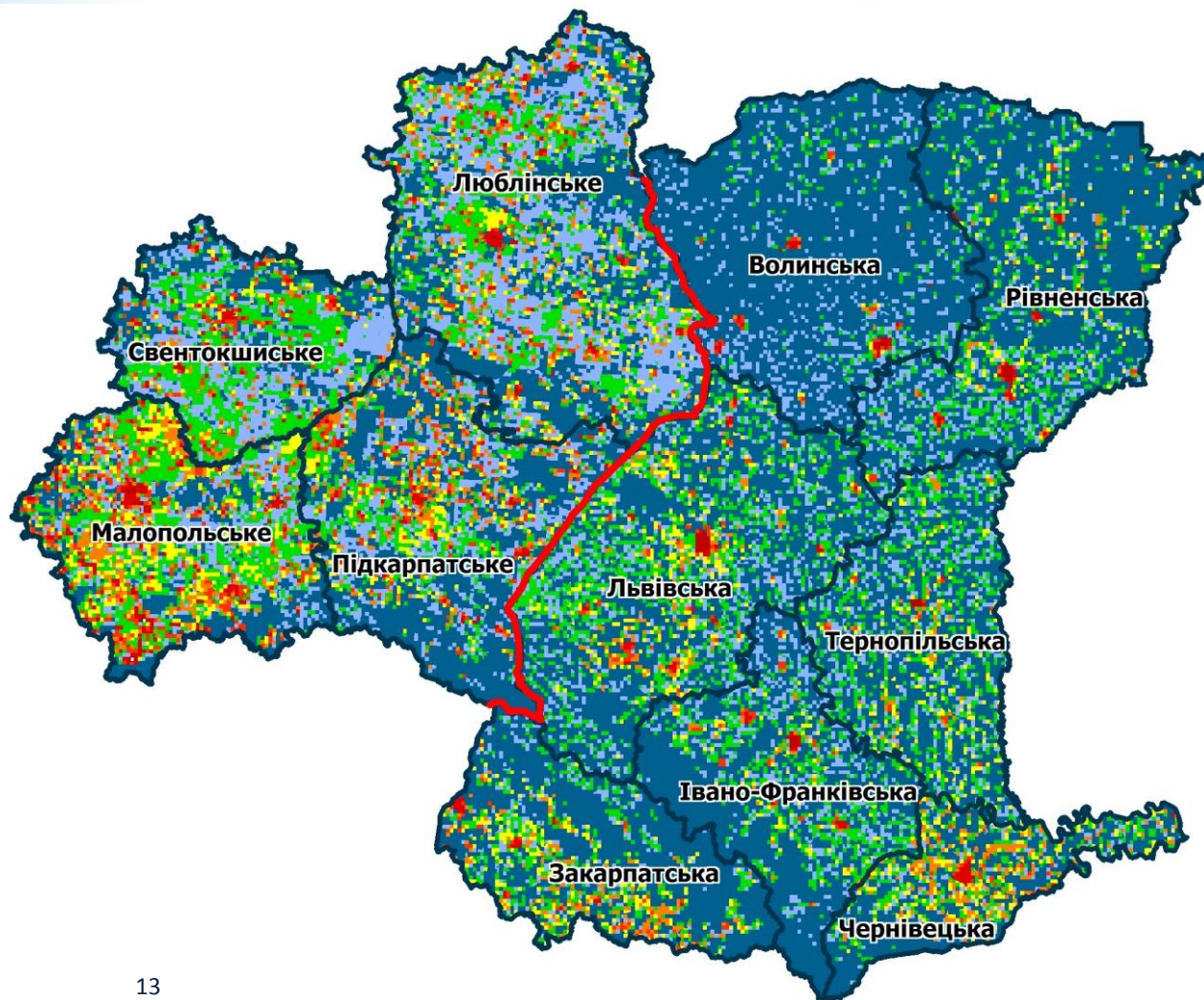
Structure of GHG emissions by type of fossil fuel for
administrative regions
(mln kg, CO2-eq., Ukraine, 2010)

Inventory results: Ukraine (Lviv region)

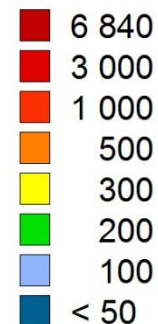


Prosm-map of specific GHG emissions in residential sector
(mln kg/sq.km., CO₂-eq., Lviv region, Ukraine, 2010)

Comparison of GHG inventory results: South-Eastern Poland and Western Ukraine



Specific GHG emissions in
residential sector
(mln kg/sq.km., CO2-eq.,
South-Eastern Poland,
Western Ukraine, 2010)



Comparison of GHG inventory results: South-Eastern Poland and Western Ukraine

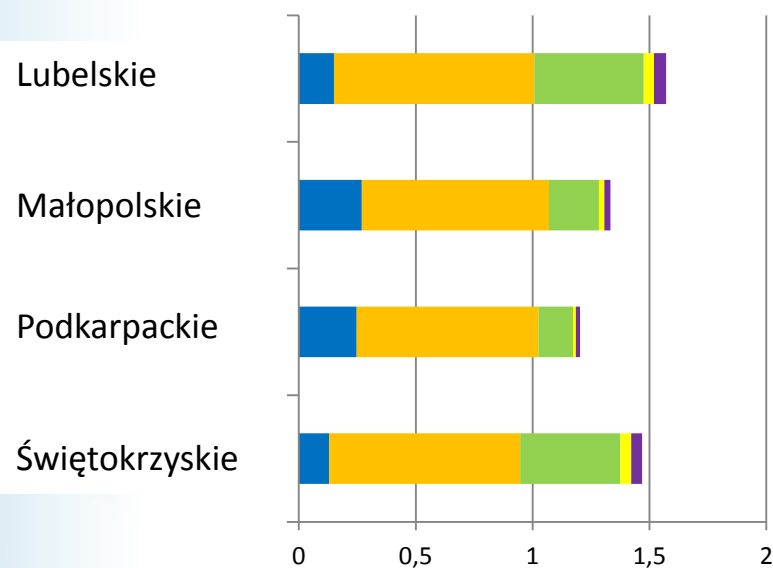


Fig. 1. Structure of GHG emissions per capita by type of fossil fuel (thousands kg per capita, CO₂-eq., South-Eastern Poland, 2010)

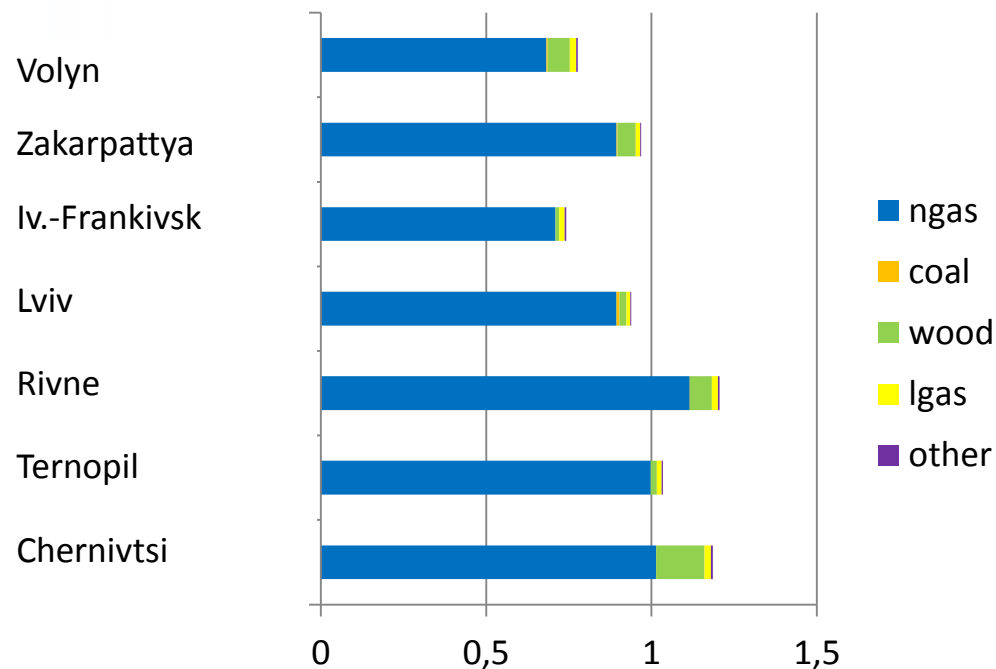
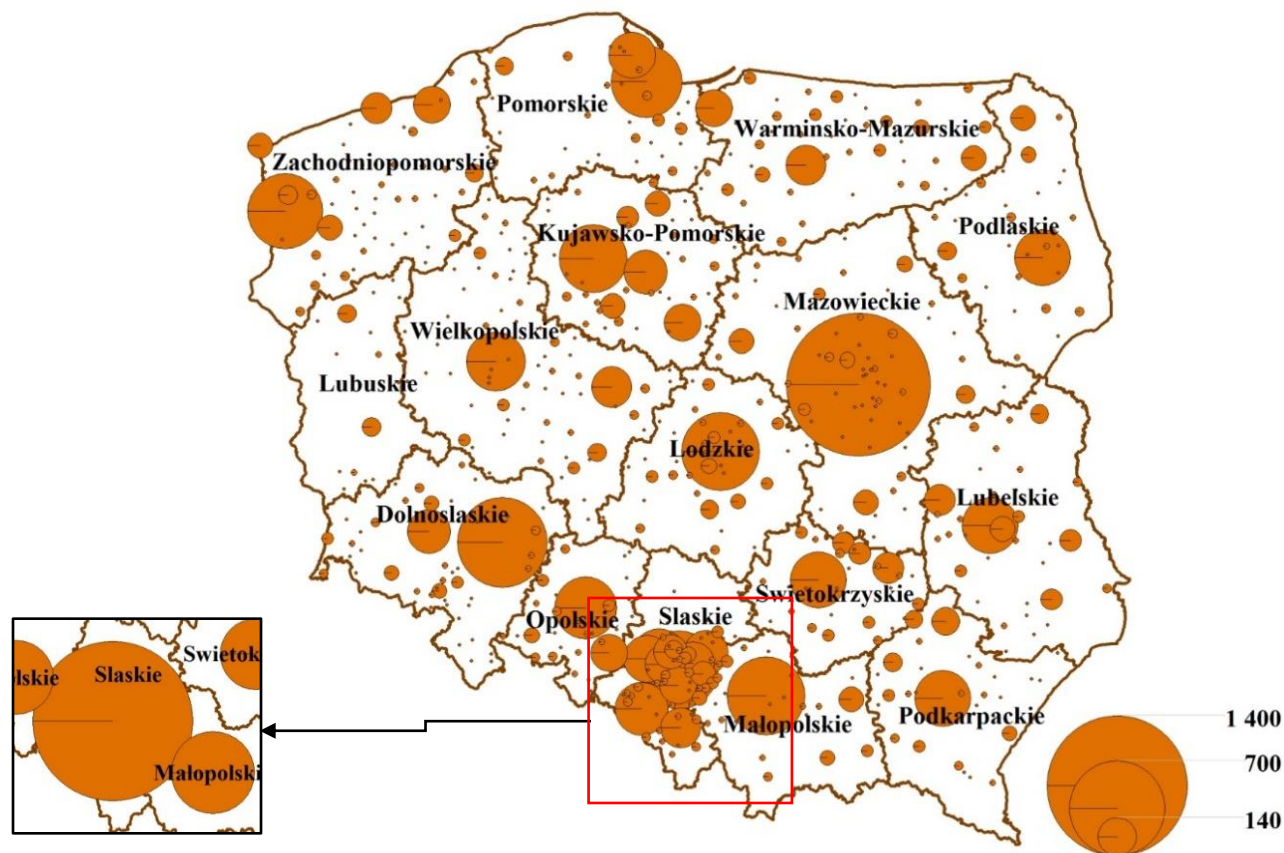


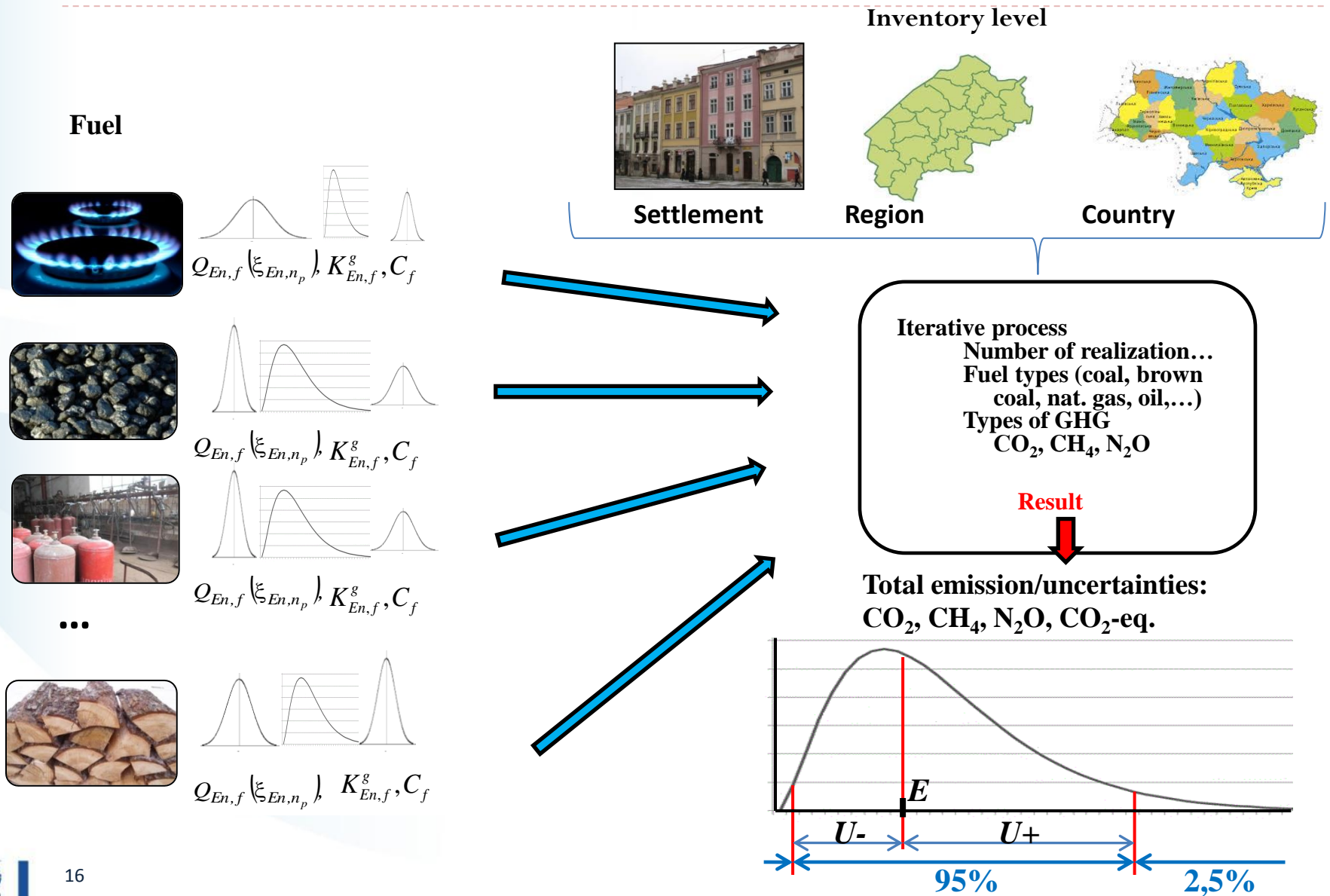
Fig. 2. Structure of GHG emissions per capita by type of fossil fuel (thousands kg per capita, CO₂-eq., Western Ukraine, 2010)

GHG emissions from the heat production



Greenhouse gas emissions from heat production in Poland
(thousands tons, CO₂-equivalent, 2010)

Uncertainty analysis: Monte-Carlo method

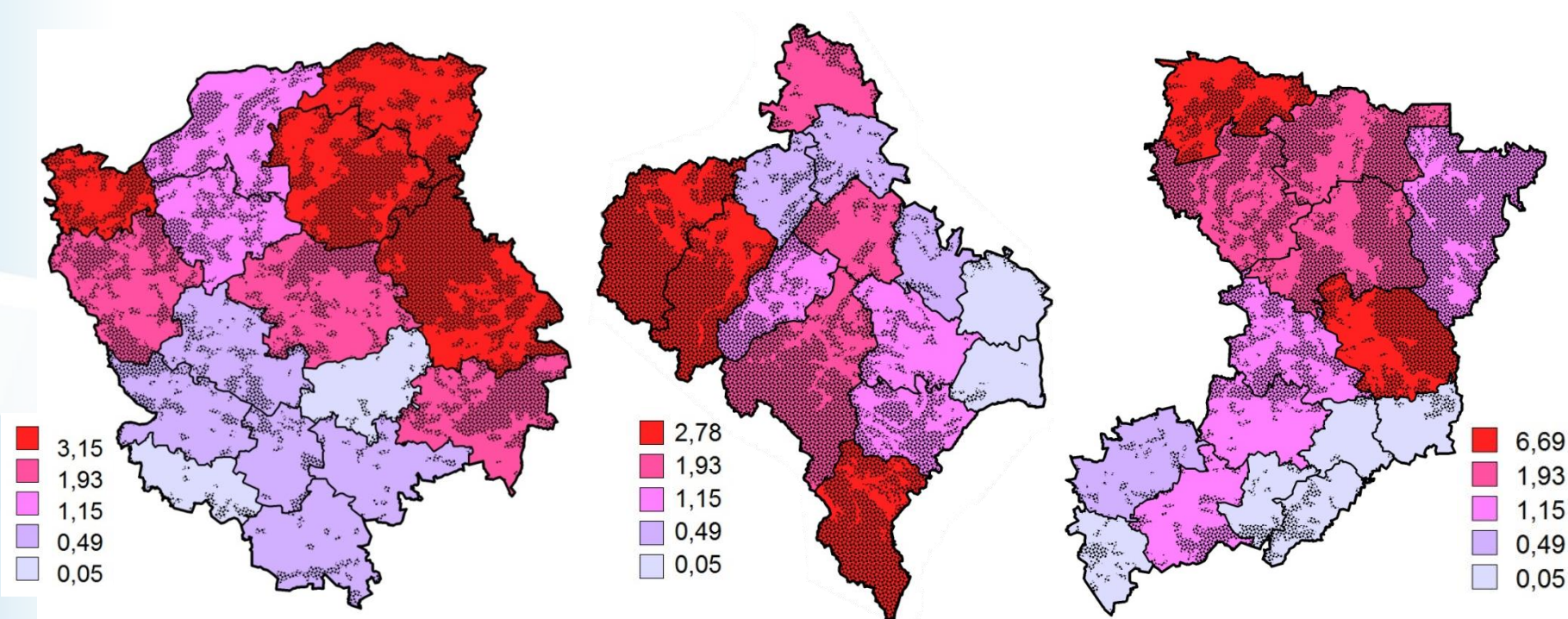


Uncertainty analysis: Monte-Carlo method

Voivodeship	CO ₂ , Gg (uncertainty, %)	CH ₄ , Gg (uncertainty, %)	N ₂ O, Gg (uncertainty, %)	Total emission Gg (uncertainty, %)
Lower Silesian	2635,8	5,4	0,03	2780,50
	(-12,9 : +14,9)	(-21,4 : +25,5)	(-19,7 : +23,2)	(-13,2 : +15,2)
Kuyavian-Pomeranian	1741,5	4,0	0,02	1848,54
	(-14,5 : +16,7)	(-21,5 : +25,5)	(-19,9 : +23,4)	(-14,7 : +16,9)
Lublin	1982,9	4,5	0,03	2103,56
	(-14,3 : +16,5)	(-21,5 : +25,6)	(-19,8 : +23,4)	(-14,5 : +16,8)
Lubusz	700,4	1,3	0,01	735,77
	(-11,8 : +13,6)	(-21,3 : +25,4)	(-19,3 : +22,7)	(-12,1 : +14,0)
Łódź	2451,2	5,8	0,03	2606,73
	(-15,0 : +17,3)	(-21,6 : +25,6)	(-20,0 : +23,6)	(-15,2 : +17,5)
Lesser Poland	3091,0	6,3	0,04	3258,20
	(-12,7 : +14,7)	(-21,4 : +25,5)	(-19,7 : +23,3)	(-13,0 : +15,0)
.....

Warmian-Masurian	900,1	1,9	0,01	949,97
	(-13,0 : +15,0)	(-21,4 : +25,5)	(-19,5 : +23,0)	(-13,2 : +15,3)
Greater Poland	3013,4	5,9	0,04	3172,27
	(-12,4 : +14,3)	(-21,3 : +25,4)	(-19,5 : +22,9)	(-12,7 : +14,6)
West Pomeranian	1163,7	1,8	0,01	1210,98
	(-9,6 : +11,0)	(-21,0 : +25,1)	(-18,6 : +21,9)	(-9,9 : +11,3)

Validation of the approach: Ukraine, wood combustion

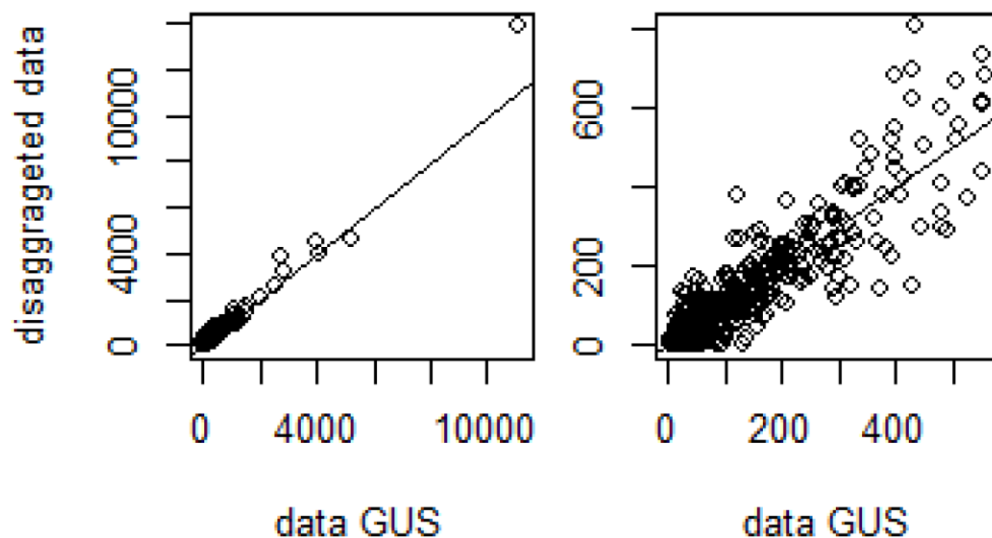


Statistical data divided by disaggregated data
(black dots – forest cover)

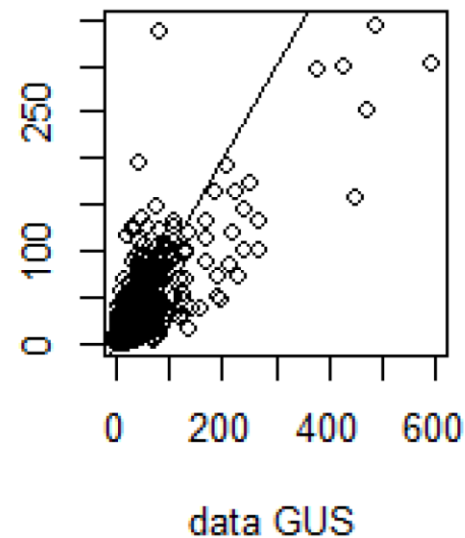
Validation of the approach: Poland, natural gas

Natural gas combustion at the level of municipalities

Urban areas



Rural areas



Conclusions

- ▶ A new understanding of the residential sector
- ▶ Lack of detailed data on FF combustion -> disaggregation -> spatial uncertainty
- ▶ Validation and uncertainty analysis are important components of spatial inventory



Thank you for your attention!

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