# Segmentation and behavior of regional housing markets in Poland

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## Project rationale

#### Knowledge gap:

- » Little effort has been made to understand the nature of demand on emerging markets (CEE countries), after system transformation
- » Regional housing market differences and their long-term consequences
- Availability of data:
  - » Database on Housing Transaction in Poland (aggragated at poviat level)

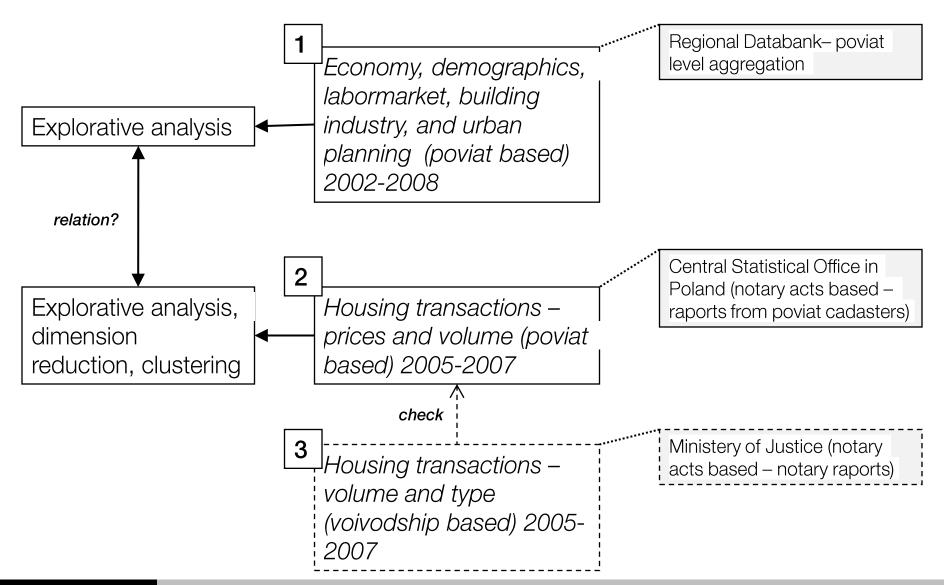


#### Previous research

- Heterogenity and regional differences among housing markets was explored in several studies – mostly in US. Example:
  - » Goetzmann and Wachter (1995)
- Research on local differences of european housing markets is less developed. Some examples:
  - » Pinto (2005) segmentation of housing market in Italy
  - » Forys (2006, 2008) clustering of selected local housing market in Poland



# Project data and analysis flow





## Methods and techniques

# A. Exploration

A.1 Goal: Construction of indicators and data audit

# B. Principal Component Analysis (PCA)

B.1 Goal: Dimension reduction

B.2 Based on indicators constructed in exploration phase

# C. Cluster Analysis (CA)

C.1 Goal: Grouping poviats (counties) in groups sharing same economic conditions

C.2 Based on principal component scores



## Principal component analysis

#### Indicators

- » Demographics (net migrations, household compositions)
- » Labor market (unemploiment, incomes)
- » Tourism industry (tourists, beds, hotels)
- » Urbanisation (urbanized and rural land, population density)
- » Housing stock (dwellings, masterplans)

#### Outcomes:

- » Dimension reduction
- » 12 economic indicators → 4 principal components

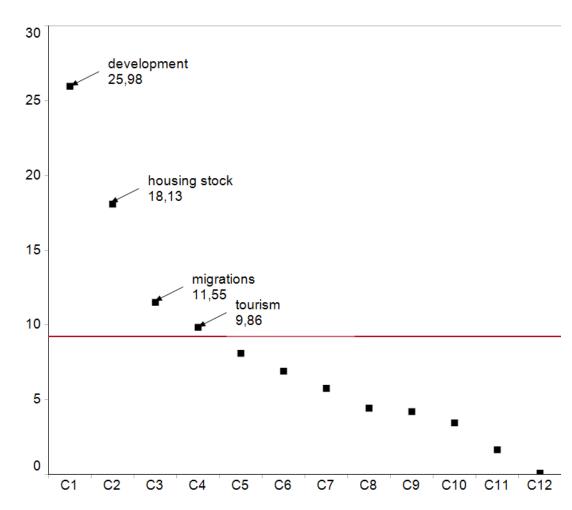


## PCA – component extraction

Total	Variance	Explained
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Component	Sums of Squared Loadings			
	Total	Cumulative		
		%		
C1 Development	3,11	25,98		
C2 Housing stock	2,17	44,04		
C3 Migrations	1,38	55,55		
C4 Tourism	1,18	65,40		

Extraction Method: Principal Component Analysis.





# PCA – component description

Rotated Component Matrix<sup>a</sup>

	Component			
	C 1 Development	C 2 Housing stock	C 3 Migrations	C 4 Tourism
Households/Dwellings [2002]	-,085	,960	-,076	,103
Small households/Households [2002]	,705	-,234	-,244	-,189
Households in separate dwelling rate[2002]	,010	,973	-,064	,066
Rural land area/Total area[2002]	-,747	-,014	,185	-,033
Area covered by masterplans [2007]	,090	-,138	-,018	-,500
Unemployment rate[ 2007]	-,274	,069	-,576	,535
Longterm unemployed /Unemployed [2002-07]	-,403	-,356	-,205	,016
Working population/Population [2008]	,739	,121	,096	,052
Net migration [2002-07]	-,058	-,049	,883	,096
Economic activity[2002-07]	,826	-,029	,313	,145
Avarage income [2002-07]	,578	-,132	,201	-,415
Tourists per 1k inhabitants [2002-07]	,313	-,103	,080	,743

Extraction Method: Principal Component Analysis.

Rotation Method: Varimax with Kaiser Normalization.

a. Rotation converged in 6 iterations.



#### CA - introduction

- Hierarchical cluster analysis
  - » Variables: principal component scores
  - » Distance measure: squared Euclidean distance
  - » Clustering methods: Ward, furthest neighbor
  - » Dendrograms analysis: investigating stability of solutions and final number of clusters
- K-mean cluster analysis:
  - » Number of clusters: 5



## CA – description of clusters

#### C1 thin (102)

- » Geographically mostly eastern Poland, rural and underdeveloped
- » Weak economic growth, high unemployment, decreasing population

#### C2 satelitte (41)

- » Geographically in proximity to cities, urbanizing and developing at rapid pace
- » Very high immigration, fast growing, potential urban sprawl

#### C3 robust (71)

- » Solid fundamental economic growth, highly urbanized, mostly largest cities
- » Low unemployment, high average incomes, young and small households

#### C4 fashionable (14)

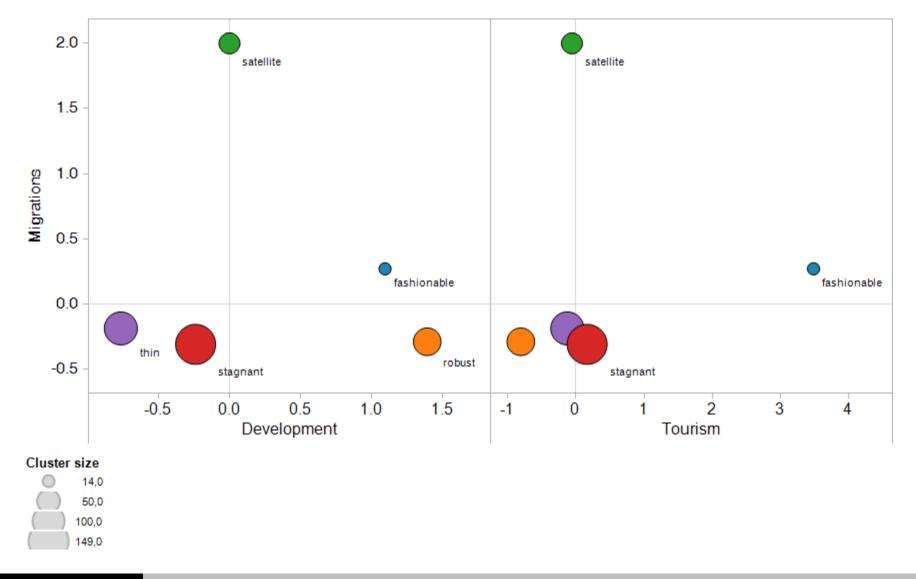
- » Mostly ski-resorts (in Tatras Mountains) and beach-resorts (Baltic seacoast)
- » Investment, second homes' markets, weak fundamentals

#### C5 stagnant (149)

- » Moderate sized cities, weak development potential, large housing stock
- » High unemployment, deacreasing population, weak economic base

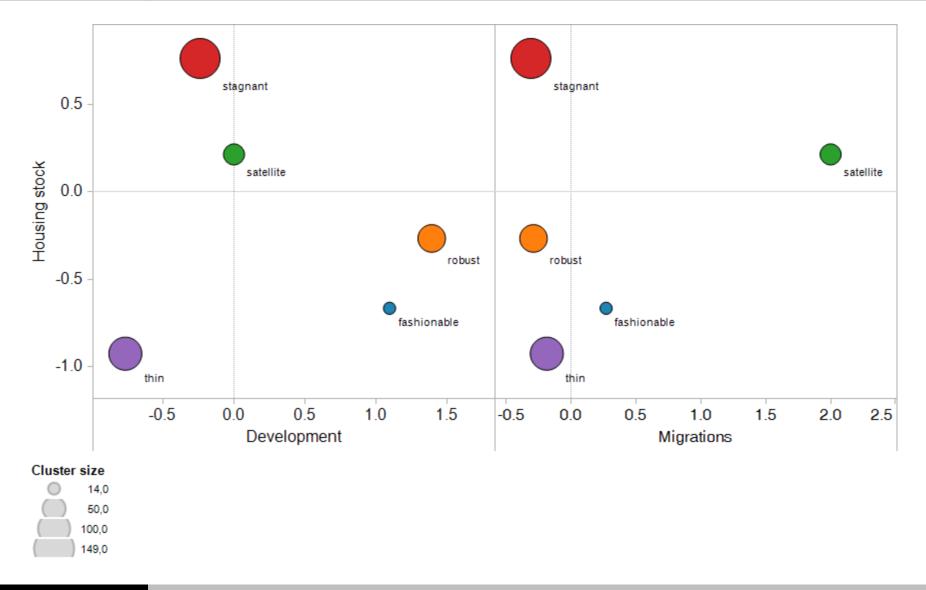


# Clusters' positioning [1]



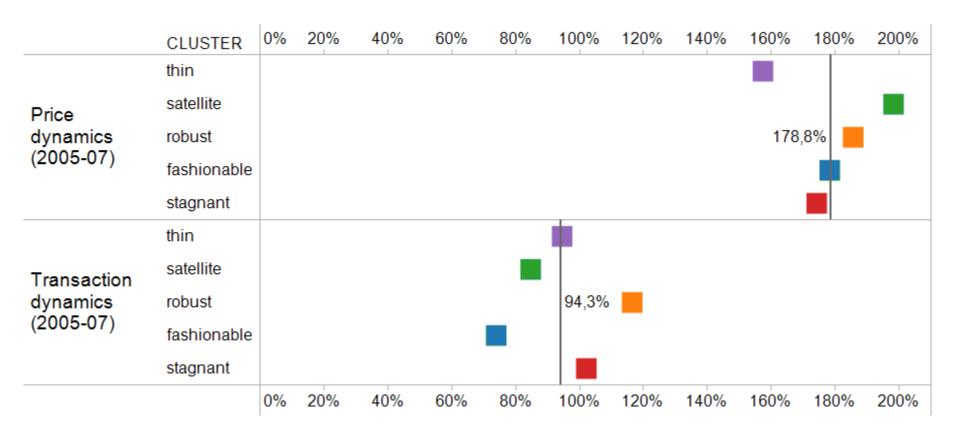


# Clusters' positioning [2]



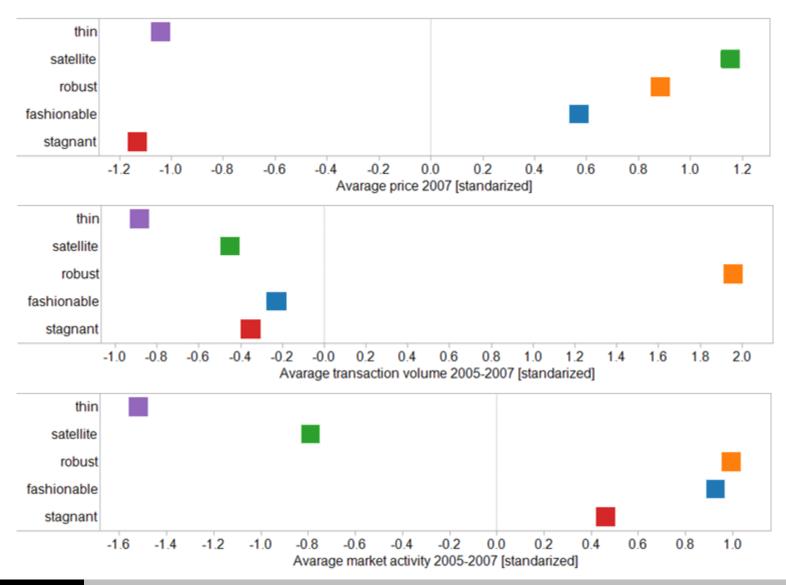


# Clusters' and housing market [1]



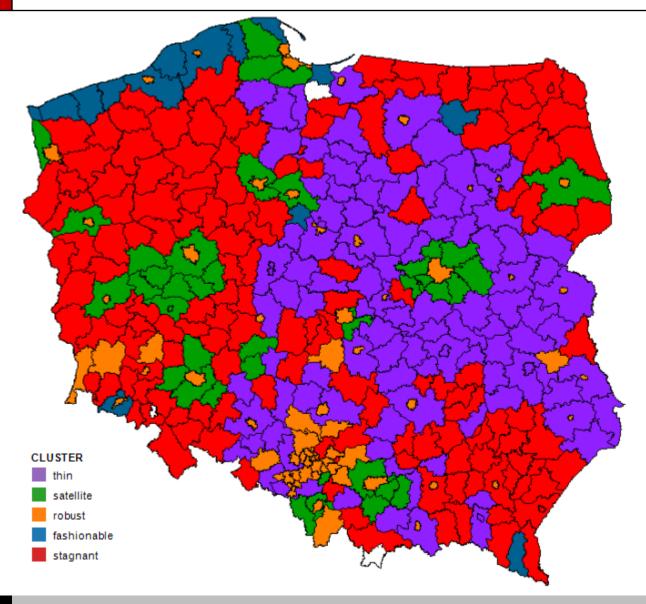


# Clusters' and housing market [2]





# Geographical differences





#### Conclusions

- Polish housing markets are heterogenous, but several local markets share similar economic base
- Local fundamentals have influence on housing market outcomes (transaction, prices, dynamics)
- Post EU accesion housing boom was not shared by every polish poviat:
  - » Biggest boom (and bubble potential) in *robust* and *fashionable* market clusters
  - » Strong urban sprawl in proximity to major agglomerations satellite cluster
  - » Weak effects in most of stagnant and thin markets driven by weak demographic and economical fundamentals

