



TÜRKİYE CUMHURİYET  
MERKEZ BANKASI

# Is There a Housing Bubble or a Quality Boom in Turkey? Evidence from Hedonic Price Adjustment

by

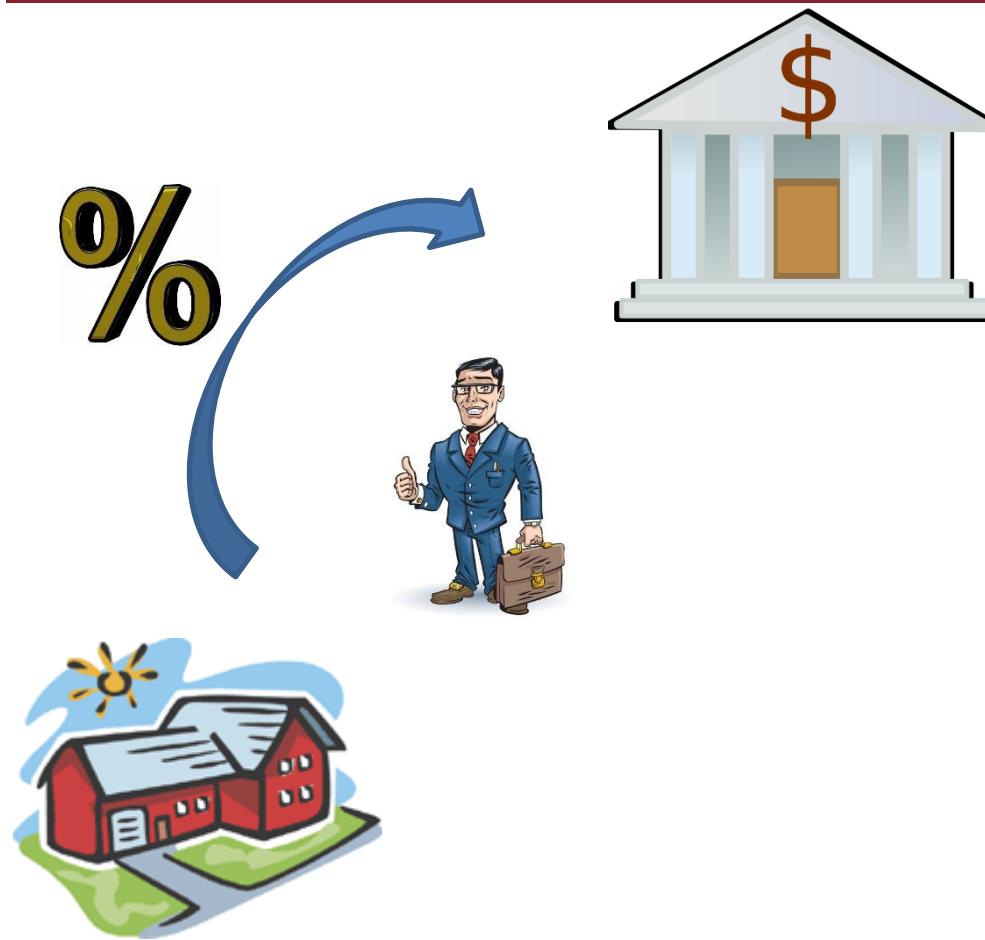
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Statistics Department

ISI WSC, July 27, 2015, Rio de Janeiro

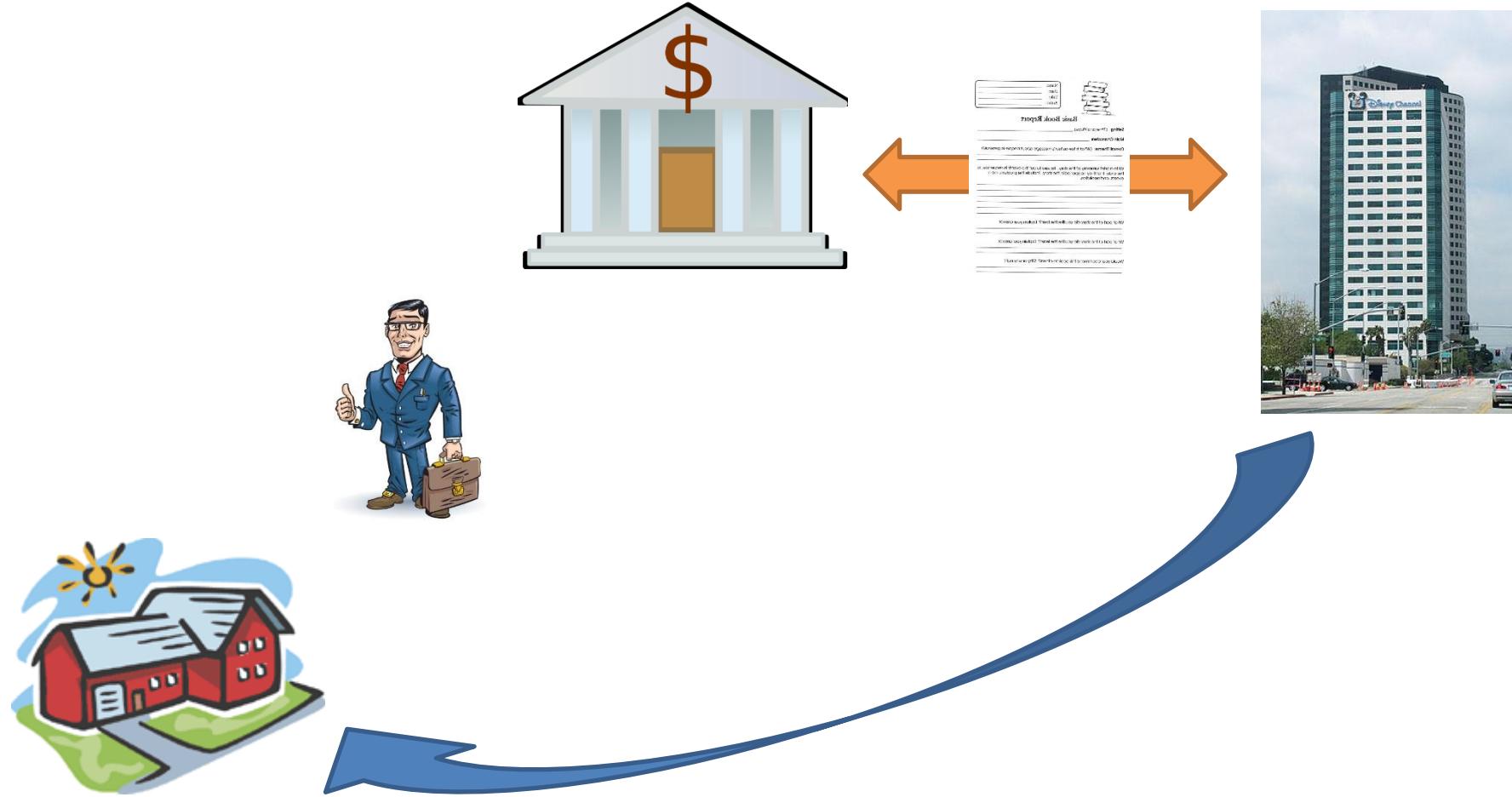
# OUTLINE

- House Price Index for Turkey (**THPI**)
  - Data source
  - Methodology
- Measuring Quality Changes and Hedonic House Price Index (**THHPI**)
  - Motivation
  - Methodology
  - Results

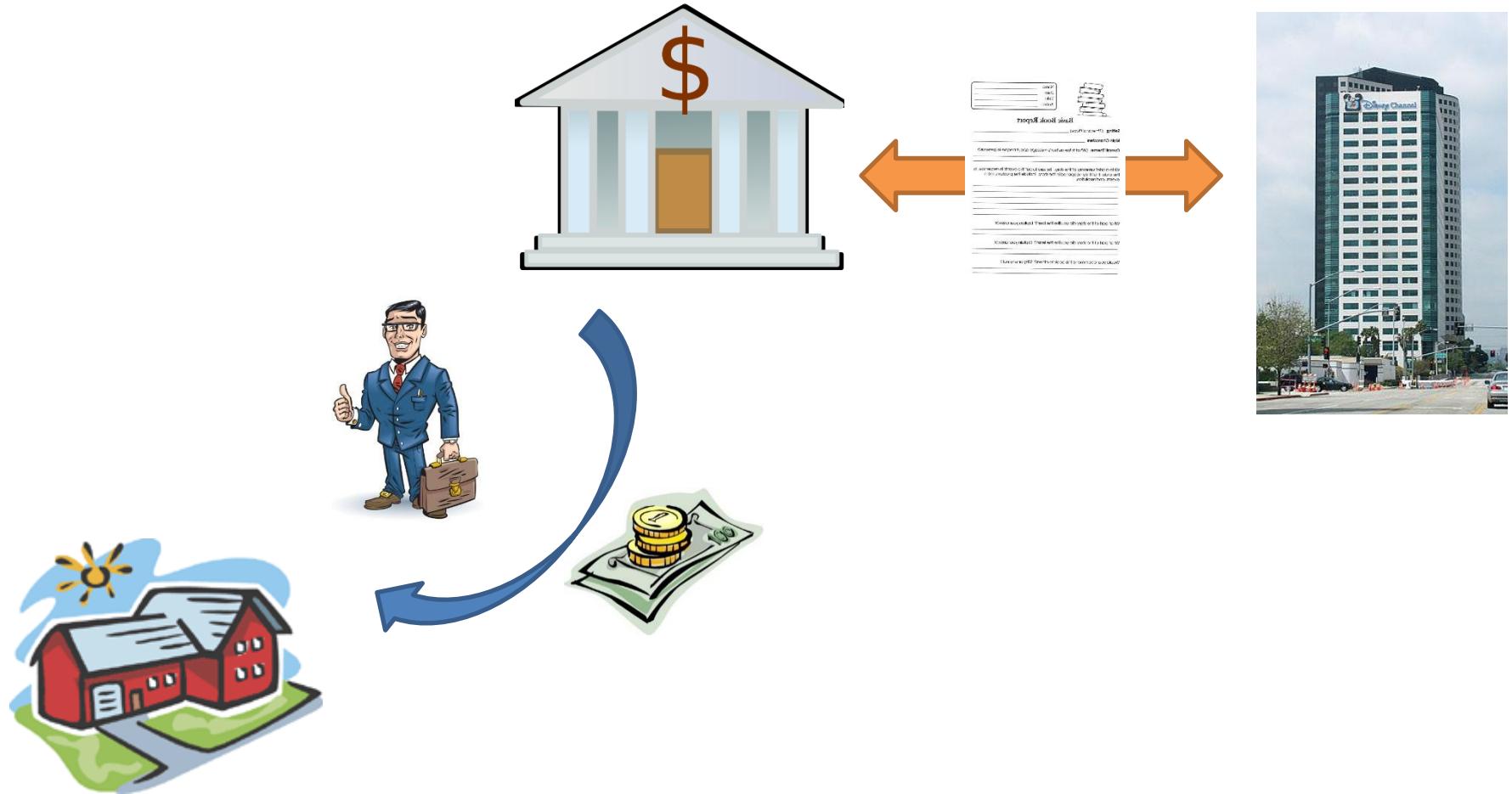
# THPI - Data Source



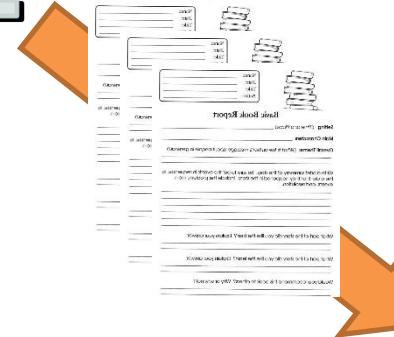
# THPI - Data Source



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# THPI - Data Source



# METHODOLOGY

- **Stratified Median Price**
- **Strata can be formed by taking into account location, area, age, type of the properties**

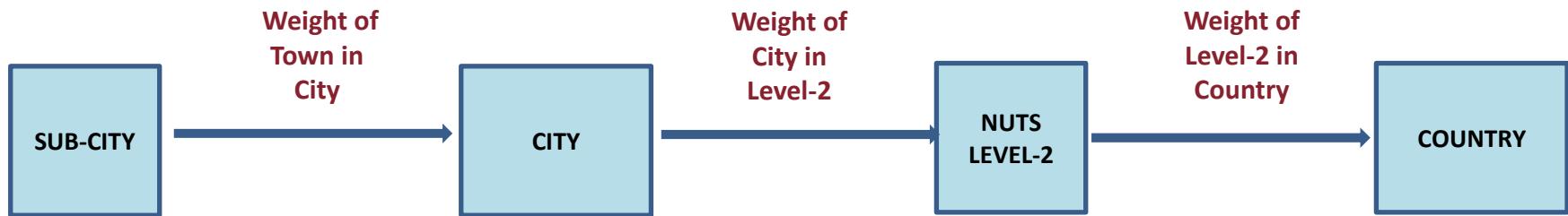
**Geographical location** constituted the basis for stratification

- **Grouping by location is practical**
- **Variation of prices by location is a key characteristic of housing markets**

# WEIGHTING

## ➤ Weighting:

- Data on house sales in the previous year registered by the General Directorate of Land Registry and Cadastre are used as weights for aggregating the strata in constructing THPI
- Weights are updated each year



# EXTREME VALUES AND INDEXATION

- We also perform Tukey's Hinges

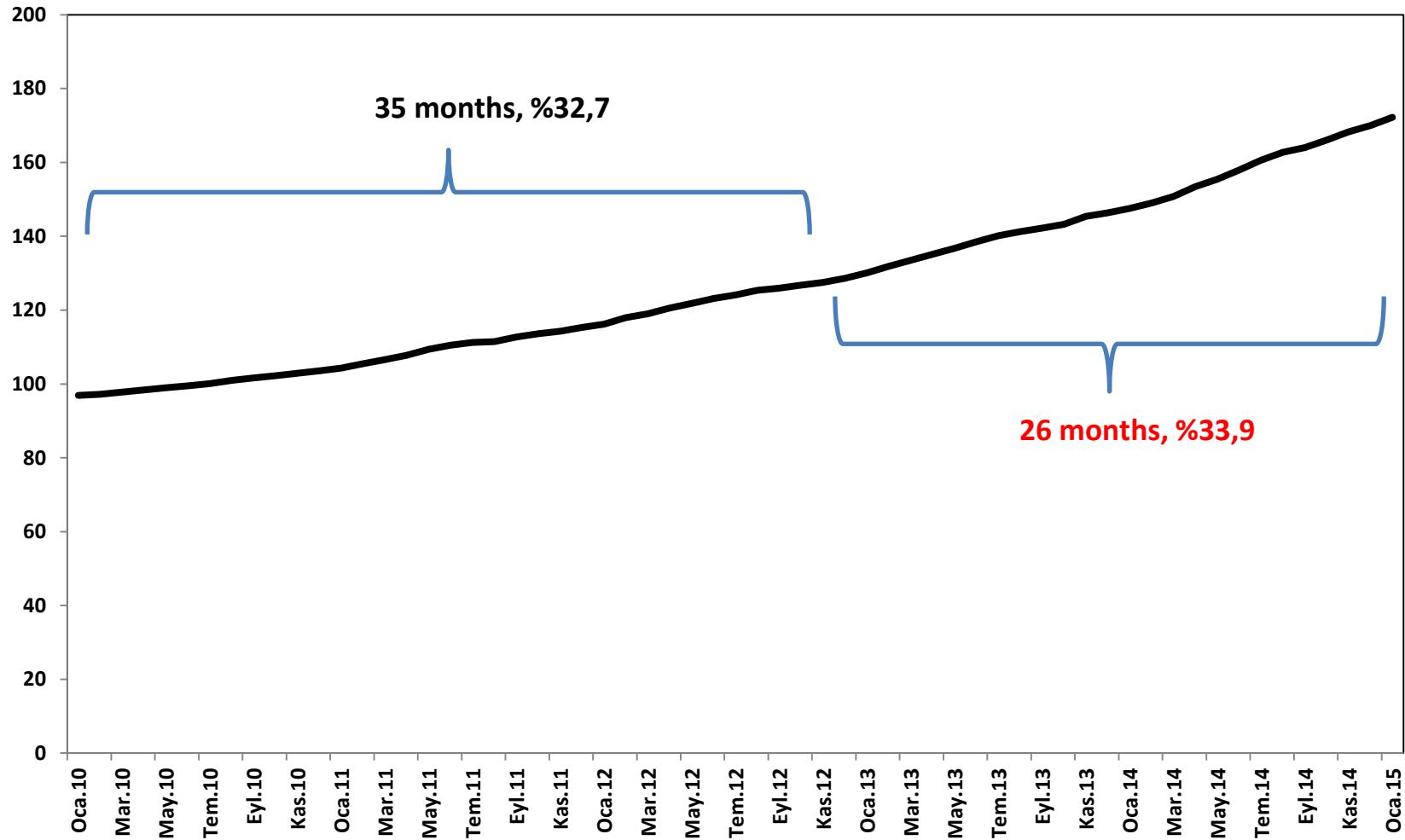
**Q3+3\*(Q3-Q1) > median unit price > Q1-3\*(Q3-Q1)**

- Indexation:

- Chain Laspeyres Index

$$I^{ty} = \sum_i \left( \frac{\omega_i^y p_i^{ty}}{\sum \omega_i^y p_i^{12(y-1)}} \right)^* I^{12(y-1)}$$

# HPI (2010=100)



# Why HHPI?

➤ 2010



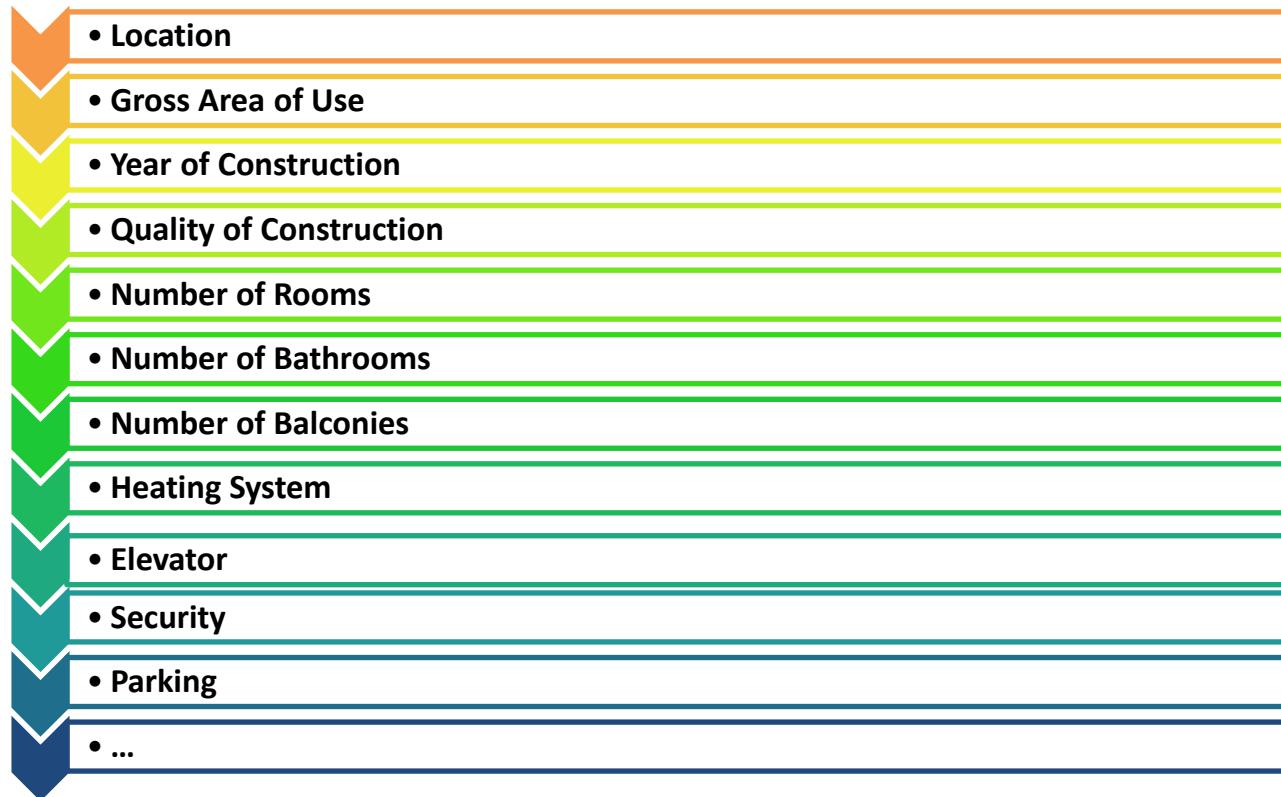
# WHY HHPI?

➤ 2014



# HPI Data Composition- Housing Characteristics

- Changes in quality directly affects house prices
- 39 variables in valuation reports



# THHPI- Method

## ➤ «Characteristic Prices Approach»

- *log-linear regression*

$$\ln p_n^t = \beta_0^t + \sum_k \beta_k^t z_{nk}^t + \varepsilon_n^t, \quad \forall i, t$$

$p_n^t$  : n property's appraisal value in period t  
 $z_{nk}^t$ : k<sup>th</sup> characteristic of apprised property

# THHPI- Method

- Same basic methodology with HPI
  - Same stratum with HPI
  - Chained Laspeyres method
  - Tukey's Hinges method (outlier detection)

# THHPI- Method

$$P_i^t = \frac{\exp(\widehat{\beta}_0^t) \exp[\sum_k \widehat{\beta}_k^t \overline{z_{nk}^0}]}{\exp(\widehat{\beta}_0^0) \exp[\sum_k \widehat{\beta}_k^0 \overline{z_{nk}^0}]}$$

$P_i^t$  : price index for period t

$\overline{z_{nk}^0}$ : average k<sup>th</sup> characteristics for the base period (all n properties')

→ Holding characteristics constant => Quality adjusted price index

# THHPI- Method

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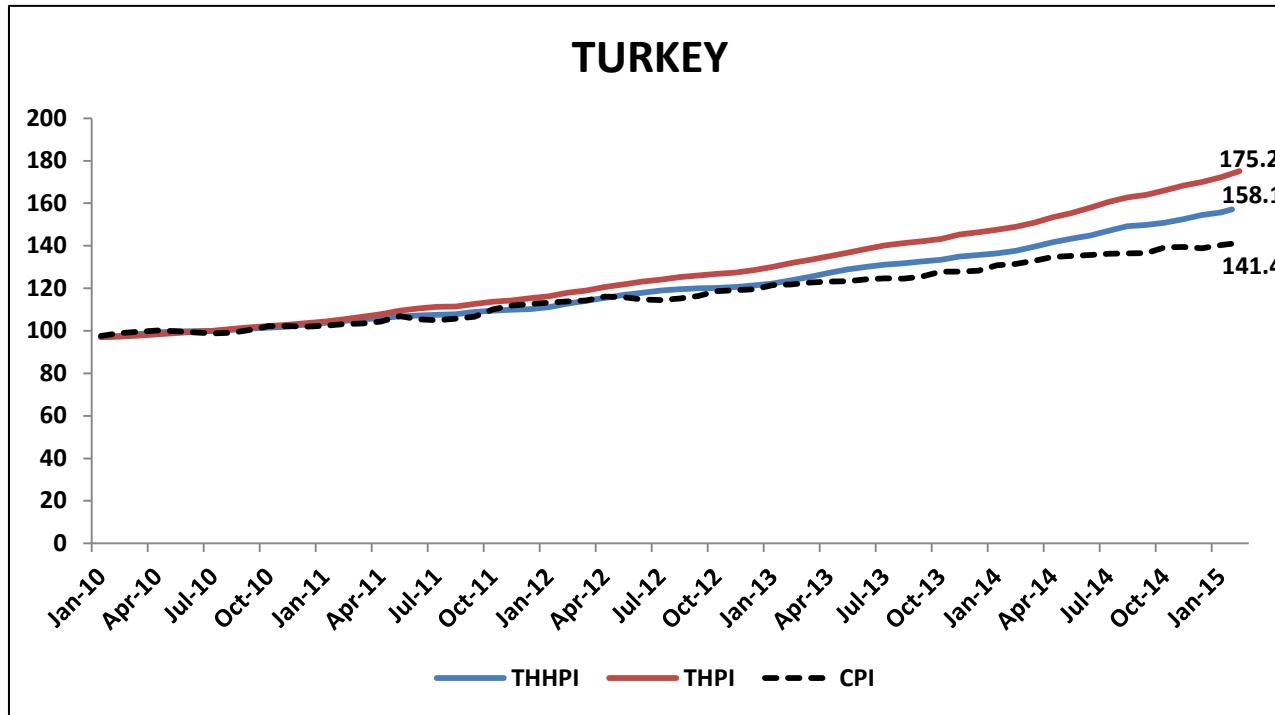
→ Holding characteristics constant => Quality adjusted price index

➤ January 2012, t=0

# HHPI- Regression Example (K.Çekmece, January 2012)

Characteristics	Coefficients
Gross Area of Use ( $m^2$ )	0.005 (0.000)**
Quality of Construction	0.109 (0.022)**
Year of Construction	0.003 (0.001)*
No. of Bedrooms	0.033 (0.017)*
No. of Bathrooms	0.084 (0.029)**
No. of Balconies	0.071 (0.017)**
Security Service	0.333 (0.032)**
Heating Type	0.118 (0.045)**
Elevator	0.133 (0.028)**
Constant	5.655 (2.040)**

# THHPI

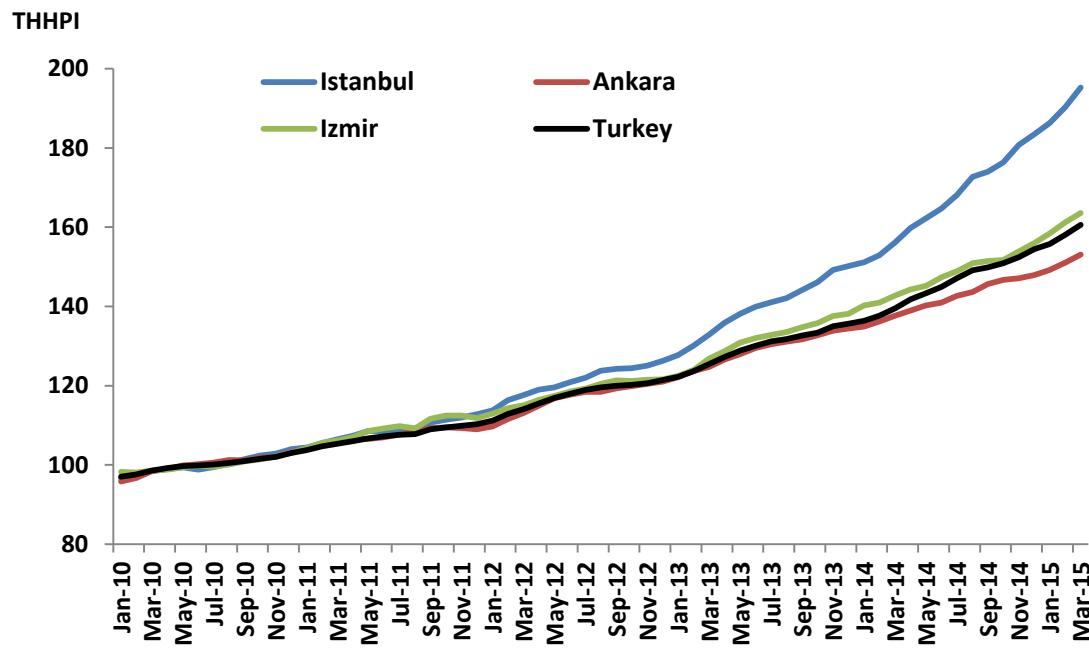


- While **THPI** was 175.2, **HHPI** was 158.1 in March 2015. The **18.2 pp** difference can be attributed to quality improvements in the housing market.

# THHPI

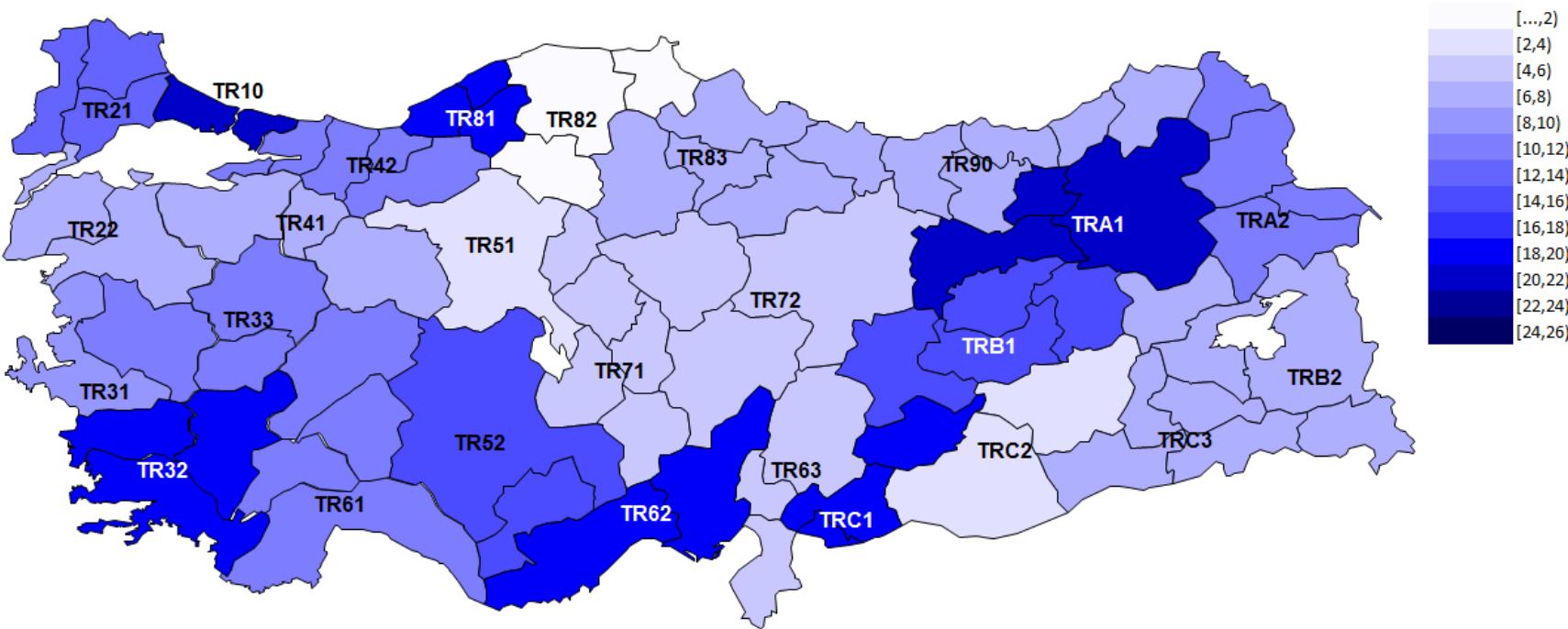


# HHPI- 3 Main Cities



March 2015	THPI	THHPI	Quality Improvement	CPI
İstanbul	216.7	195.3	21.4	143.3
Ankara	157.2	153.1	4.1	143.8
İzmir	172.5	163.6	8.9	144.5

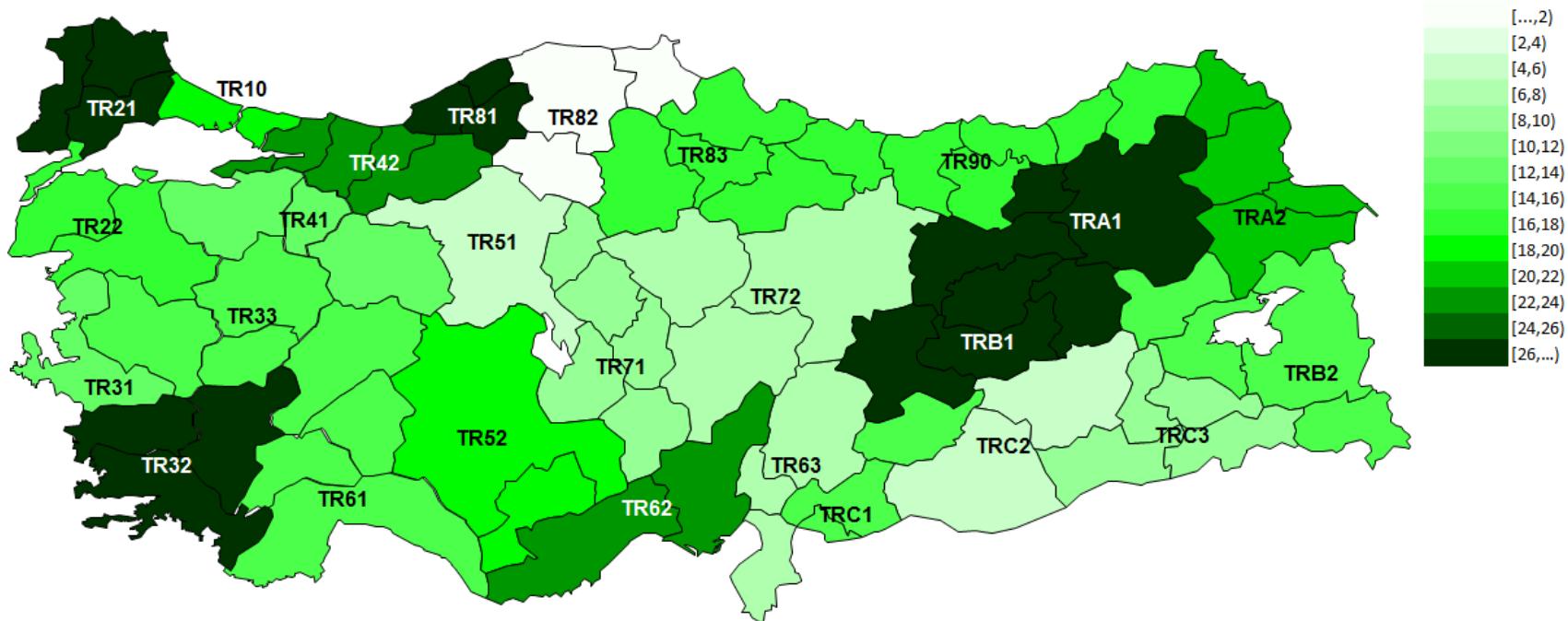
## **Quality Improvement Levels in Turkey (February 2015, ~57 months)**



Highest	Quality Improvement
TRA1 ( <i>Erzurum, Erzincan, Bayburt</i> )	21,2
TR10 ( <i>İstanbul</i> )	20,6
TR32 ( <i>Aydın, Denizli, Muğla</i> )	19,5
TRC1 ( <i>Kilis, Adıyaman, Gaziantep</i> )	19,2

<b>Lowest</b>	<b>Quality Improvement</b>
<i>TR82 (Çankırı, Kastamonu, Sinop)</i>	-0,1
<i>TRC2 (Diyarbakır, Şanlıurfa)</i>	2,7
<i>TR51 (Ankara)</i>	3,1
<i>TR63 (Hatay, K.maraş, Osmaniye)</i>	4,0

# Quality Improvement/ Price Increase (February 2015, ~57 months)



Highest	Ratio %
TR81 (Zonguldak, Bartın, Karabük)	33,3
TRB1 (Bingöl, Elazığ, Malatya, Tunceli)	32,3
TR32 (Aydın, Denizli, Muğla)	28,6
TR21 (Edirne, Kırıkkale, Tekirdağ)	28,2
TRA1 (Erzurum, Erzincan, Bayburt)	26,8

Lowest	Ratio %
TR82 (Çankırı, Kastamonu, Sinop)	-1,0
TRC2 (Diyarbakır, Şanlıurfa)	4,0
TR51 (Ankara)	5,7
TR72 (Kayseri, Sivas, Yozgat)	7,0
TR63 (Hatay, Kahramanmaraş, Osmaniye)	7,0

# Results

- Roughly, **1 out of 4** share of nominal house price increases in **Turkey**, in aggregate, and **1 out of 5** share on nominal house price increases in **İstanbul** are resulted from quality improvements.
- In 57 months period,
  - Real KFE ~%33,8
  - Quality Improvement ~%18,2
  - Pure Rise ~%15,6



TÜRKİYE CUMHURİYET  
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THANK YOU

STATISTICS DEPARTMENT

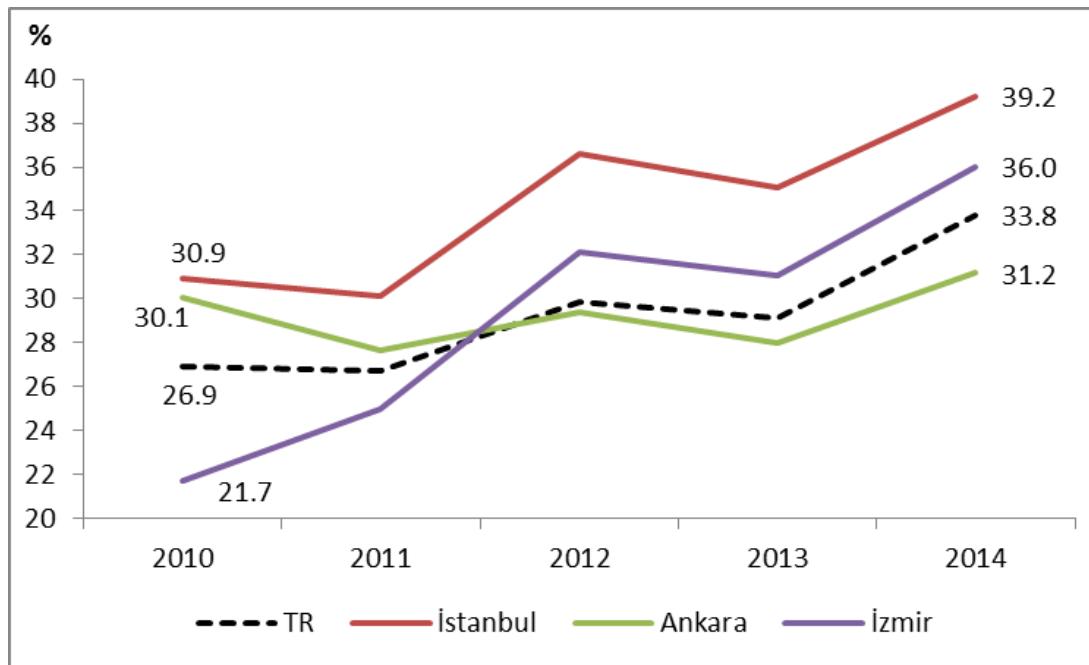
# Discussion

## Average Characteristics

	İSTANBUL		ANKARA
	Jan.12	Feb.15	Jan.12
<b>Price ('000 ₺)</b>	137.3	209.0	103.8
<b>Gross area of use (m<sup>2</sup>)</b>	96.39	89.96	117.19
<b>Year of construction</b>	2001.88	2006.42	2002.47
<b>Quality of construction</b>	0.58	0.54	0.44
<b>No. of bedrooms</b>	2.52	2.39	3.02
<b>No. of bathrooms</b>	1.24	1.22	1.23
<b>No. of balconies</b>	1.11	1.02	1.68
<b>Security</b>	0.15	0.16	0.04
<b>Heating</b>	0.91	0.87	0.91
<b>Elevator</b>	0.45	0.52	0.34
			0.44

# Discussion

## *Share of New Apartments*



# Discussion

