

# Evaluating heterogeneous effects of housing-sector-specific macroprudential policy tools on Belgian house price growth

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## Our research focus

To which extent do Belgian housing-sector-specific macroprudential policies have **heterogeneous effects on local housing markets**? If present, which factors **drive** these heterogeneous effects?

- ▶ focus on heterogeneous effects on **house price growth** driven by local housing market characteristics and house financing constraints
- ▶ heterogeneity could blur aggregate effects of macroprudential policy while affecting relative local housing market conditions

## Motivation - housing-sector-specific macroprudential policy

Since GFC → macroprudential policy to **diminish the spillovers of financial system distress to the real economy**

Housing-sector-specific macroprudential policies (e.g., risk weights for residential property, LTV, DSTI, DTI) have been **employed relatively often**

- ▶ Increase the resilience of banks
- ▶ Lower the vulnerability of lenders

→ Effects on **house prices?**

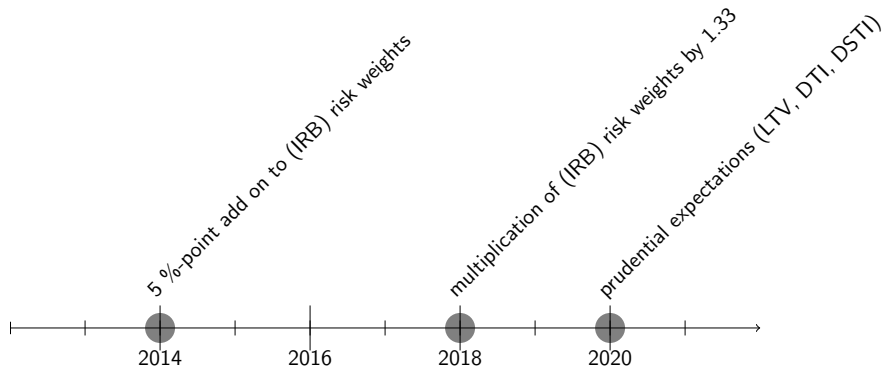
# Motivation - literature

## Heterogeneous effects on house prices?

- ▶ housing markets have a local character, driven by local supply and demand factors (Beraja et al. 2018; Case and Shiller 2003; Glaeser, Gyourkob, and Saiz 2008)
- ▶ macroprudential instruments target specific segments of the housing market

→ municipality-level data: allow to account for sizeable local variation and focus explicitly on regional heterogeneity of the effects

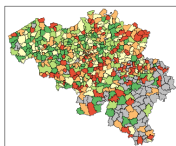
## The Belgian experience: housing-sector specific macroprudential policy



# Measuring house price growth

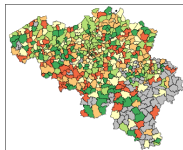
Based on a **hedonic house price index** by Reusens, Vastmans, and Damen (2022)

- ▶ allows to control for compositional changes of the housing transactions over time (“price change of an identical dwelling”)



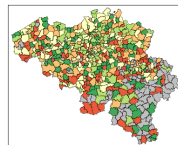
Quantiles of hedonic index growth rates in 2012 (%)

-22.91 to -2.54  
 -2.54 to 0.04  
 0.04 to 1.74  
 1.74 to 4.15  
 4.15 to 21.30  
 Missing



Quantiles of hedonic index growth rates in 2016 (%)

-16.65 to -0.90  
 -0.90 to 1.47  
 1.47 to 3.26  
 3.26 to 5.45  
 5.45 to 22.25  
 Missing



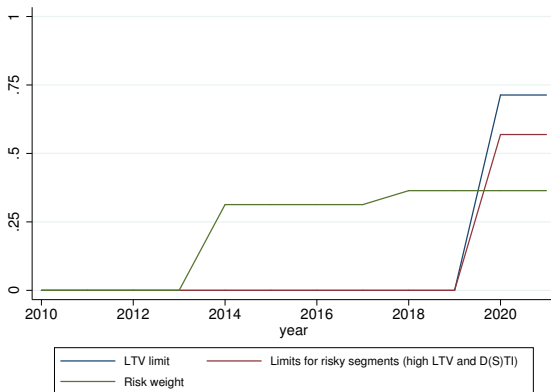
Quantiles of hedonic index growth rates in 2020 (%)

-12.72 to 2.69  
 2.69 to 5.06  
 5.06 to 8.77  
 8.77 to 9.88  
 9.88 to 28.76  
 Missing

# Macroprudential policy index

Intensity-based indices for housing-sector-specific macroprudential policy in Belgium

Extra graph



## Baseline model estimation: dynamic fixed effects model

$$y_{i,r,t} = \gamma y_{i,r,t-1} + \delta \mathbf{x}_{i,r,t-1} + \beta(\text{map}_t * \mathbf{INT}) + \alpha_i + \theta_t + \varphi_{r,t} + \epsilon_{i,r,t}$$

- ▶  $y_{i,r,t}$ : house price growth
- ▶  $\mathbf{x}_{i,r,t-1}$ : explanatory variables at municipality level
- ▶  $\text{map}_t$ : indicator of macroprudential policy
- ▶ **INT**: interaction term, see later
- ▶  $\varphi_{r,t}$ : time\*region fixed effects
- ▶ yearly data (2012-2020), 497 municipalities



## Basic model estimation: drivers of local house price growth

$$y_{i,r,t} = \gamma y_{i,r,t-1} + \delta \mathbf{x}_{i,r,t-1} + \beta(\text{map}_t * \mathbf{INT}) + \alpha_i + \theta_t + \varphi_{r,t} + \epsilon_{i,r,t}$$

- ▶  $\mathbf{x}_{i,r,t-1}$ : drivers of local house price growth (in growth rates), based on the literature (Case and Shiller 2003; Favara and Imbs 2015; Glaeser et al. 2014) Data
  - ⊙ housing demand determinants (per capita income, employment, number of households)
  - ⊙ supply determinants (housing stock)

## Basic model estimation: interaction term to investigate heterogeneous effects

Data

$$y_{i,r,t} = \gamma y_{i,r,t-1} + \delta \mathbf{x}_{i,r,t-1} + \beta(\text{map}_t * \mathbf{INT}) + \alpha_i + \theta_t + \varphi_{r,t} + \epsilon_{i,r,t}$$

**INT** contains:

- ▶  $\mathbf{X}_{i,r,t=2010,2011}$ : predetermined level variables
  - ⊙ share of low-income inhabitants in 2010
  - ⊙ share of overdue credits in 2010
  - ⊙ share of young people (25-34) in 2010
  - ⊙ share highly educated young people in 2011
  - ⊙ share of single-person households in 2010
  - ⊙ share of single-parent households in 2010
- ▶  $\text{hotness}_{i,r,t-1}$ : lagged growth of housing transactions
- ▶  $\text{debt}_{i,r,t-1}$ : lagged growth of mortgage credits

## Results baseline model: interactions separately

Specification	(1)	(2)	(3)	(4)	(5)	(7)	(8)
Dependent variable	$\Delta$ HP	$\Delta$ HP	$\Delta$ HP	$\Delta$ HP	$\Delta$ HP	$\Delta$ HP	$\Delta$ HP
Share of low-income declarations (2010) * $\Delta$ MAP			-0.155*** (0.0318)				
Share of overdue credits (2010) * $\Delta$ MAP				-0.721*** (0.250)			
Share of young people (2010) * $\Delta$ MAP					-0.289*** (0.0868)		
Share of single-person households (2010) * $\Delta$ MAP						-0.0754** (0.0316)	
Share of single-parent households (2010) * $\Delta$ MAP							-0.177* (0.118)
Lagged growth of housing transactions	-0.00192 (0.00311)						
Lagged growth of housing transactions * $\Delta$ MAP	-0.00298 (0.00832)						
Lagged growth of outstanding mortgages		0.215*** (0.0734)					
Lagged growth of outstanding mortgages * $\Delta$ MAP		0.0860 (0.150)					
Number of municipalities	497	497	497	497	497	497	497
Municipality fixed effects	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Region * time FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Lagged $\Delta$ HP	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Driving factors of $\Delta$ HP	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Standard errors in parentheses

\*\*\*  $p < 0.01$ , \*\*  $p < 0.05$ , \*  $p < 0.1$

## Results baseline model: interactions combined

Specification Dependent variable	(1) ΔHP	(2) ΔHP	(3) ΔHP	(4) ΔHP
Share of low-income declarations (2010) * ΔMAP			-0.137*** (0.0373)	-0.134*** (0.0323)
Share of young people (2010) * ΔMAP		-0.230*** (0.0820)	-0.232** (0.110)	-0.236** (0.108)
Share of highly-educated young people (2011) * ΔMAP		0.0558*** (0.0175)		
Share of single-person households (2010) * ΔMAP			0.00913 (0.0396)	0.00615 (0.0364)
Share of single-parent households (2010) * ΔMAP			-0.0569 (0.115)	-0.0646 (0.125)
Lagged growth of housing transactions	-0.00164 (0.00324)			-0.00171 (0.00349)
Lagged growth of housing transactions * ΔMAP	-0.00245 (0.00882)			-0.00160 (0.00855)
Lagged growth of outstanding mortgages	0.217*** (0.0740)			0.217*** (0.0655)
Lagged growth of outstanding mortgages * ΔMAP	0.0837 (0.122)			0.0296 (0.131)
Number of municipalities	497	497	497	497
Municipality fixed effects	Yes	Yes	Yes	Yes
Region * time FE	Yes	Yes	Yes	Yes
Lagged ΔHP	Yes	Yes	Yes	Yes
Driving factors of ΔHP	Yes	Yes	Yes	Yes

Standard errors in parentheses

\*\*\* p&lt;0.01, \*\* p&lt;0.05, \* p&lt;0.1

## Hot vs cold markets: Quantile Regressions

Quantile regressions calculate regressions coefficients  $\beta_\tau$  for each  $\tau$ -th quantile, relating a vector  $X_{i,t}$  to the  $\tau$ -th percentile of the **conditional distribution** of the endogenous variable  $y_{i,t}$ .

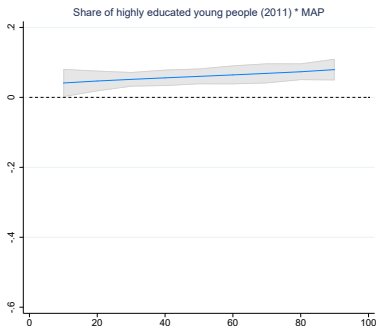
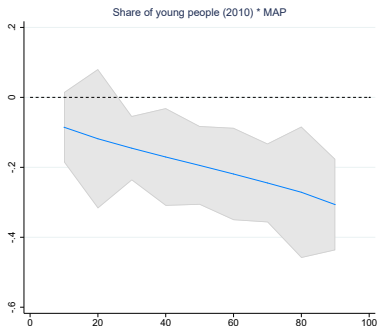
### Our focus:

The distribution of growth of the hedonic house price index across the 497 Belgian municipalities, divided into deciles.

→ left tail = cold housing market, right tail = hot housing market

$$y_{i,r,t,\tau} = \gamma_\tau y_{i,r,t-1} + \delta_\tau \mathbf{x}_{i,r,t-1} + \beta_\tau (\text{map}_t * \text{INT}) \\ + \alpha_{i,\tau} + \theta_{t,\tau} + \varphi_{r,t,\tau} + \epsilon_{i,r,t,\tau}$$

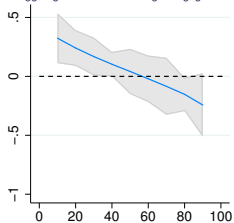
## Results: combined interactions



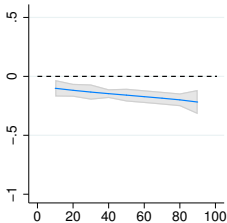
## Results: combined interactions

[More results](#)

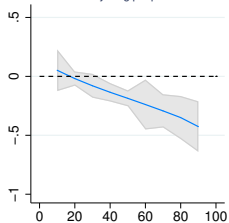
Lagged growth of outstanding mortgages \* MAP



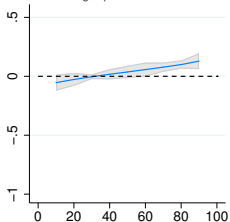
Share of low income declarations \* MAP



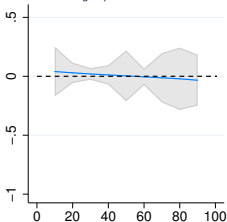
Share of young people \* MAP



Share of single-person households \* MAP



Share of single-parent households \* MAP



## Robustness checks

- ▶ different thresholds for data cleaning
- ▶ different proxies (housing supply, share of low income, MAP index)
- ▶ alternatives for jackknife corrections
- ▶ extensions: potentially heterogeneous effects of other common shocks to the Belgian economy (COVID-19, monetary policy) and analysis of the 'woonbonus' regulation



## Conclusion

- ▶ **geographic heterogeneity of residents matters:** macroprudential tightening has a stronger dampening effect on house price growth in local housing markets with more constrained residents
- ▶ **heterogeneity in housing markets activity matters:** different effects in hot and cold housing markets

## Conclusion

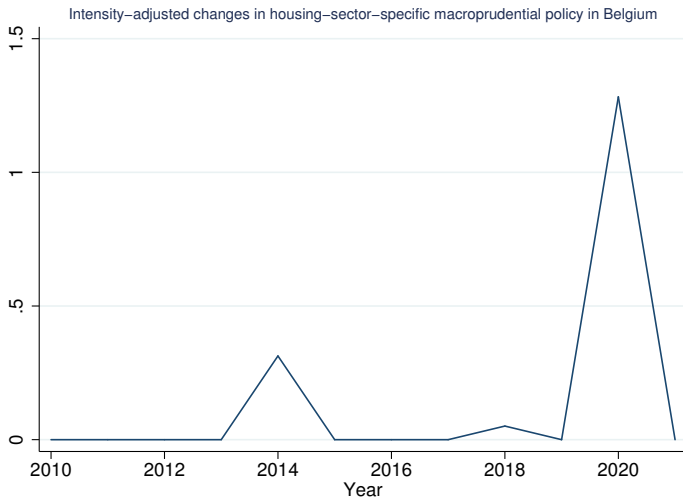
- ▶ **geographic heterogeneity of residents matters:** macroprudential tightening has a stronger dampening effect on house price growth in local housing markets with more constrained residents
- ▶ **heterogeneity in housing markets activity matters:** different effects in hot and cold housing markets
- ▶ housing-sector-specific macroprudential policies can be an adequate tool to stabilize hot local housing markets characterized by more financially constrained and high-risk residents
- ▶ potential distributional consequences
- ▶ future work: need for more granular data capturing borrower, house, and mortgage characteristics

## Bibliography

- Beraja, Martin et al. (Sept. 2018). "Regional Heterogeneity and the Refinancing Channel of Monetary Policy". In: *The Quarterly Journal of Economics* 134.1, pp. 109–183.
- Case, Karl E. and Robert J. Shiller (2003). "Is There a Bubble in the Housing Market?" In: *Brookings Papers on Economic Activity* 2, pp. 299–362.
- Favara, Giovanni and Jean Imbs (2015). "Credit Supply and the Price of Housing". In: *American Economic Review* 105.3, pp. 958–92.
- Glaeser, Edward L., Joseph Gyourkob, and Albert Saiz (2008). "Housing supply and housing bubbles". In: *Journal of Urban Economics* 64, pp. 198–217.
- Glaeser, Edward L et al. (2014). "Housing dynamics: An urban approach". In: *Journal of Urban Economics* 81, pp. 45–56.
- Reusens, Peter, Frank Vastmans, and Sven Damen (May 2022). "The impact of changes in dwelling characteristics and housing preferences on house price indices". In: *NBB Working Paper Research* 406.

# Macroprudential policy index

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# Basic model estimation: local drivers of house price growth

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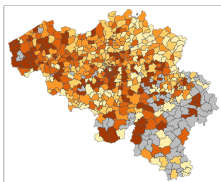
**Table: Descriptives of main driving forces of house price growth**

	Mean	Std. Dev.	Min	Max	N
Median income growth	2.44	1.78	-7.78	19.38	4,644
Employment growth	0.64	1.30	-21.51	23.57	4,644
Growth housing stock	0.01	0.70	-4.24	6.02	5,676
Household growth	0.29	0.55	-8.21	4.11	5,664

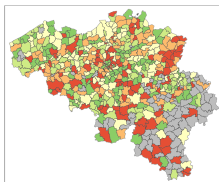
## Basic model estimation: local drivers of house price growth

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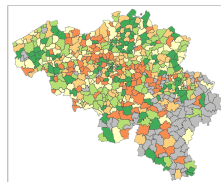
Median income growth across 497 Belgian municipalities for 2012, 2016, and 2019 (%)



Quantiles of growth of median income in 2012 (%)



Quantiles of growth of median income in 2016 (%)



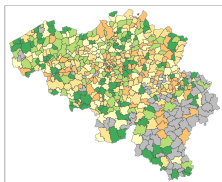
Quantiles of growth of median income in 2019 (%)



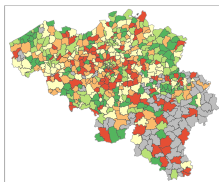
## Basic model estimation: local drivers of house price growth

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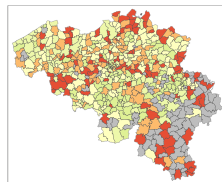
Employment growth across 497 Belgian municipalities for 2012, 2016, and 2019 (%)



Quantiles of employment growth in 2012 (%)



Quantiles of employment growth in 2016 (%)



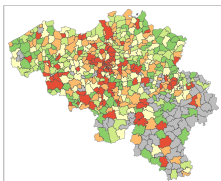
Quantiles of employment growth in 2019 (%)



## Basic model estimation: local drivers of house price growth

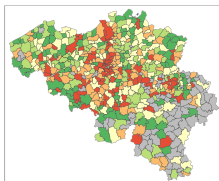
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Growth of households across 497 Belgian municipalities for 2012, 2016, and 2020 (%)



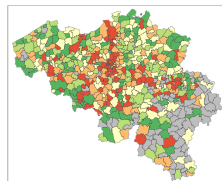
Quantiles of growth of number of household relative to the population in 2012 (%)

- 2.500 to -0.164
- 0.164 to 0.108
- 0.108 to 0.389
- 0.389 to 0.645
- 0.645 to 2.010
- Missing



Quantiles of growth of number of households relative to the population in 2016 (%)

- 1.594 to -0.230
- 0.230 to 0.119
- 0.119 to 0.329
- 0.329 to 0.681
- 0.681 to 1.873
- Missing



Quantiles of growth of number of households relative to the population in 2020 (%)

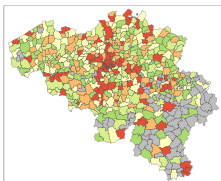
- 1.594 to -0.230
- 0.230 to 0.119
- 0.119 to 0.329
- 0.329 to 0.681
- 0.681 to 1.873
- Missing



## Basic model estimation: local drivers of house price growth

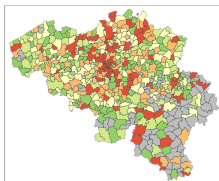
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Growth of the housing stock across 497 Belgian municipalities for 2012, 2016, and 2020 (%)



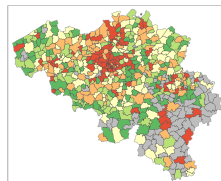
Quantiles of growth of the housing stock in 2012 (%)

■ -3.586 to -0.087  
■ -0.497 to -0.144  
■ -0.144 to 0.108  
■ 0.108 to 0.472  
■ 0.472 to 1.982  
■ Missing



Quantiles of growth of the housing stock in 2016 (%)

■ -3.122 to -0.474  
■ -0.474 to -0.121  
■ -0.121 to 0.208  
■ 0.193 to 0.491  
■ 0.491 to 2.079  
■ Missing



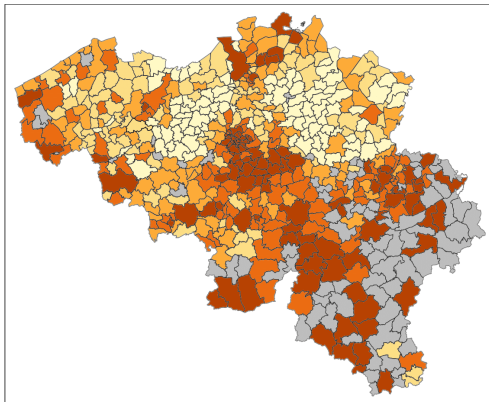
Quantiles of growth of the housing stock in 2020 (%)

■ -3.703 to -0.986  
■ -0.986 to -0.180  
■ -0.180 to 0.128  
■ 0.128 to 0.523  
■ 0.523 to 2.089  
■ Missing

## Basic model estimation: interactions

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- cross-sectional variation: share of low income in 2010



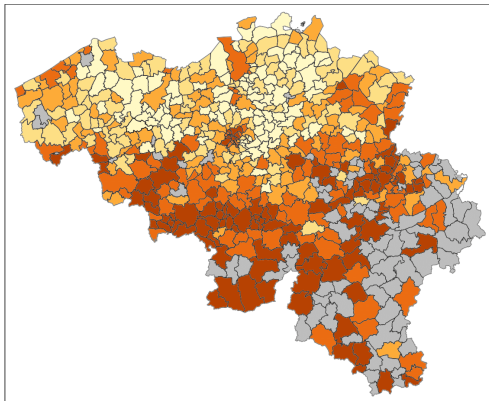
Quantiles of share of low income declarations in 2010 (%)



## Basic model estimation: interactions

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- ▶ cross-sectional variation: overdue mortgage credit in 2010



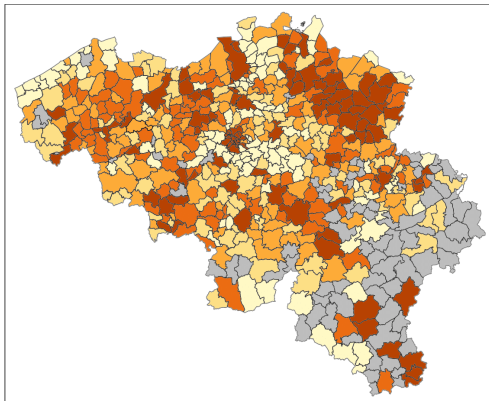
Quantiles of overdue mortgage credits relative to total in 2010 (%)



## Basic model estimation: interactions

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- cross-sectional variation: share of young people in 2010



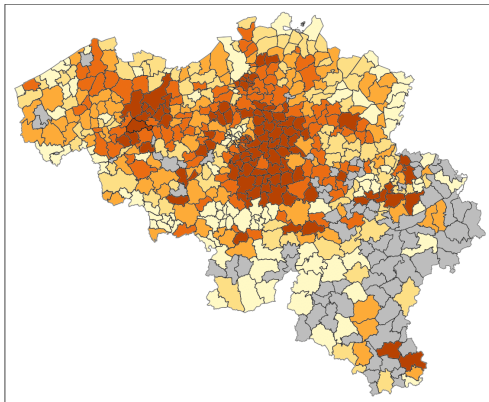
Quantiles of the share of young (25–34 year old) people in 2010 (%)



## Basic model estimation: interactions

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- ▶ cross-sectional variation: share of highly educated 25–34 year olds in 2011



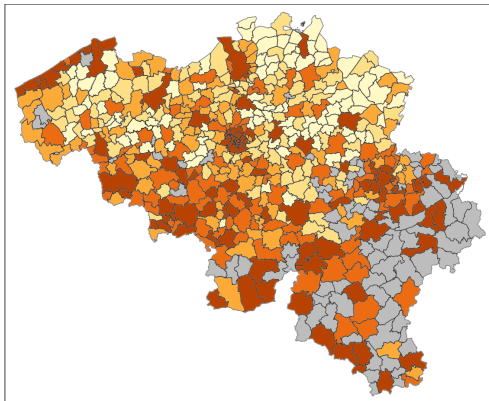
Quantiles of the share of highly educated young (25–34) people in 2011 (%)



## Basic model estimation: interactions

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- cross-sectional variation: share of single households in 2010



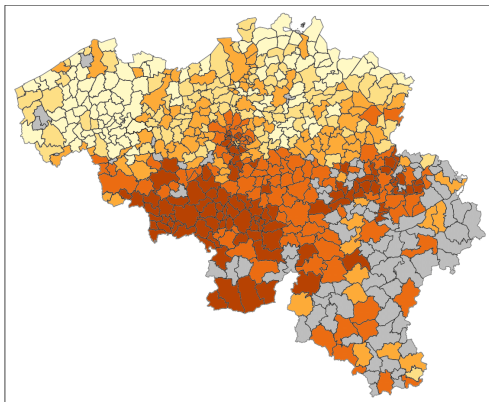
Quantiles of share of single (1 person) households in 2010 (%)



## Basic model estimation: interactions

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- cross-sectional variation: share of single parent households in 2010



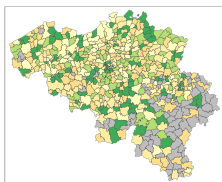
Quantiles of the share of single parent households in 2010 (%)



## Basic model estimation: interactions

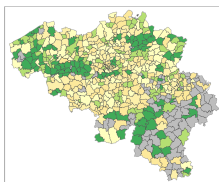
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Growth of housing transactions across 497 Belgian municipalities for 2012, 2016, and 2020 (%)



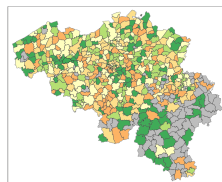
Quintiles of growth of housing transactions per 1000 inhabitants in 2012 (%)

- 48.6 to -12.9
- 12.9 to -0.7
- 0.7 to 4.6
- 4.7 to 17.8
- 17.9 to 155.8
- Missing



Quintiles of growth of housing transactions per 1000 inhabitants in 2016 (%)

- 48.7 to -7.7
- 7.7 to 7.8
- 7.9 to 20.5
- 20.6 to 40.0
- 40.1 to 255.3
- Missing



Quintiles of growth of housing transactions per 1000 inhabitants in 2020 (%)

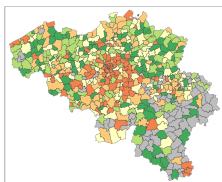
- 84.1 to -8.6
- 8.0 to -1.9
- 0.2 to 7.7
- 7.8 to 18.7
- 18.8 to 17.5
- Missing



## Basic model estimation: interactions

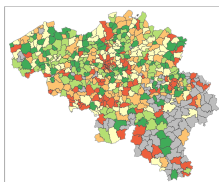
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Growth of outstanding mortgages across 497 Belgian municipalities for 2012, 2016, and 2020 (%)



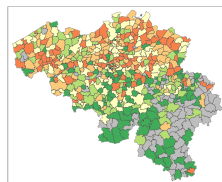
Quantiles of growth of outstanding mortgages per 1000 inhabitants in 2012 (%)

-0.004 to 0.041
0.041 to 1.305
1.305 to 1.917
1.917 to 3.716
3.716 to 6.574
Missing



Quantiles of growth of outstanding mortgages per 1000 inhabitants in 2016 (%)

-0.196 to 1.004
1.004 to 1.908
1.908 to 2.478
2.478 to 3.398
3.398 to 7.048
Missing

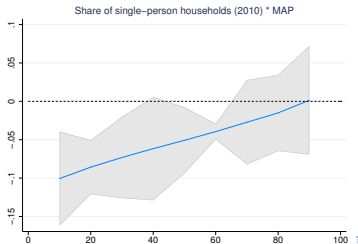
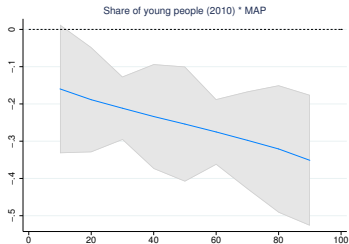
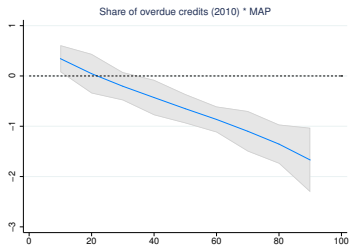
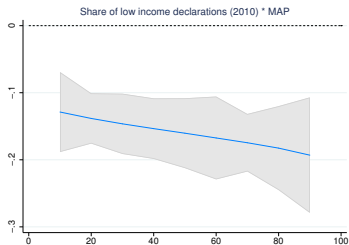


Quantiles of growth of outstanding mortgages per 1000 inhabitants in 2020 (%)

-4.992 to -0.819
-0.819 to 0.121
0.121 to 0.177
0.177 to 1.618
1.618 to 6.581
Missing

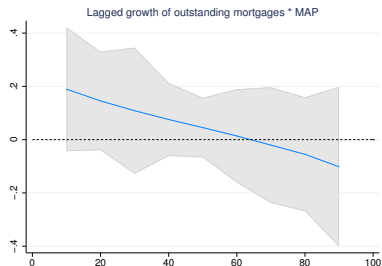
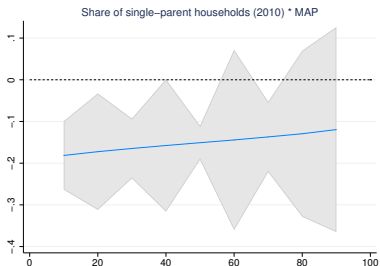
## Extra results

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## Extra results

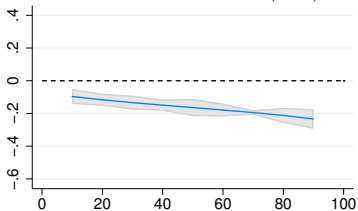
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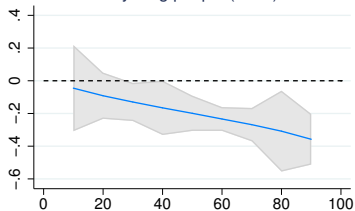
## Extra results

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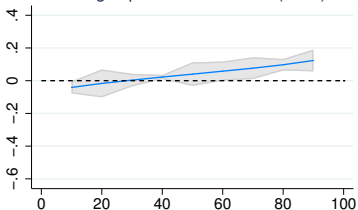
Share of low income declarations (2010) \* MAP



Share of young people (2010) \* MAP



Share of single-person households (2010) \* MAP



Share of single-parent households (2010) \* MAP

