

*BEHAVE 2020-2021 – 6th European Conference on Behaviour and Energy Efficiency*

# Are tenants willing to pay for energy efficiency?

## Evidence from a small-scale spatial analysis in Germany

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Gefördert durch:





**Background**



**Data and  
Methodology**



**Results**

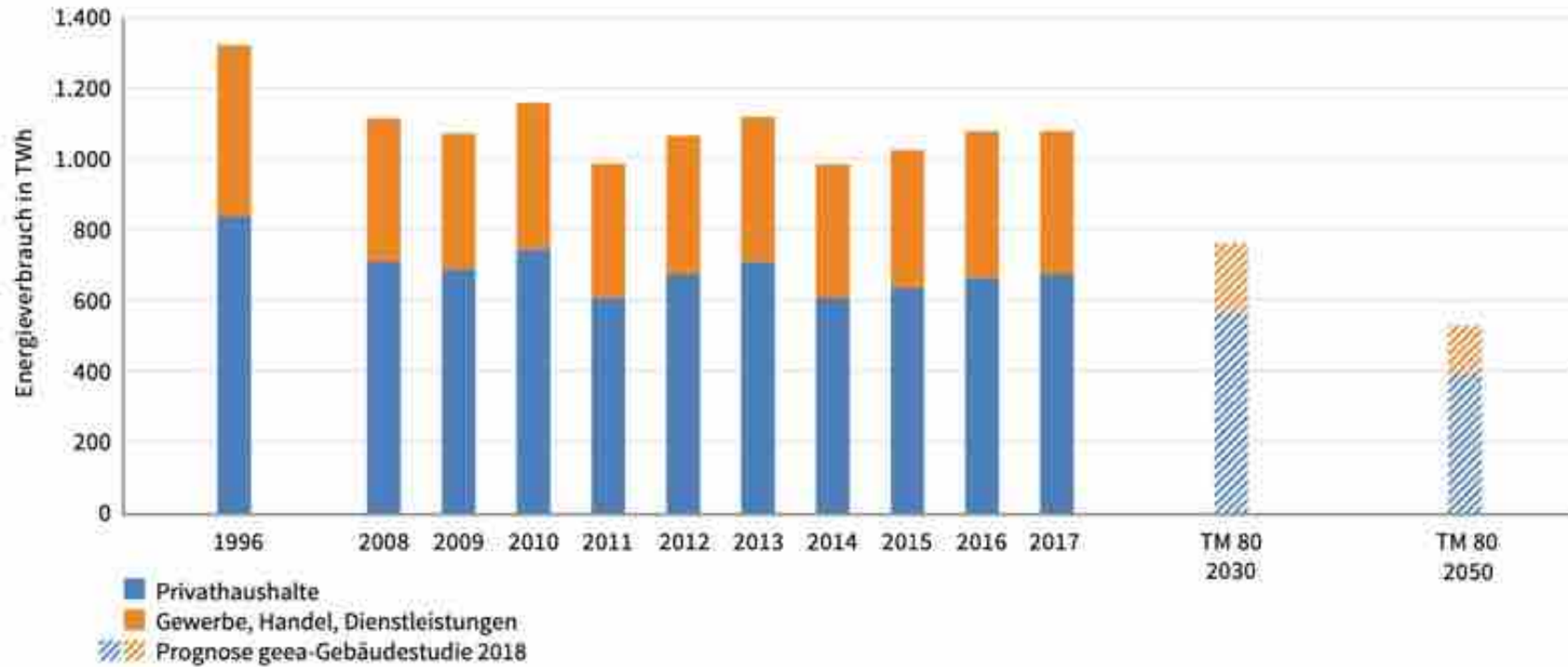


**Discussion**

# Background

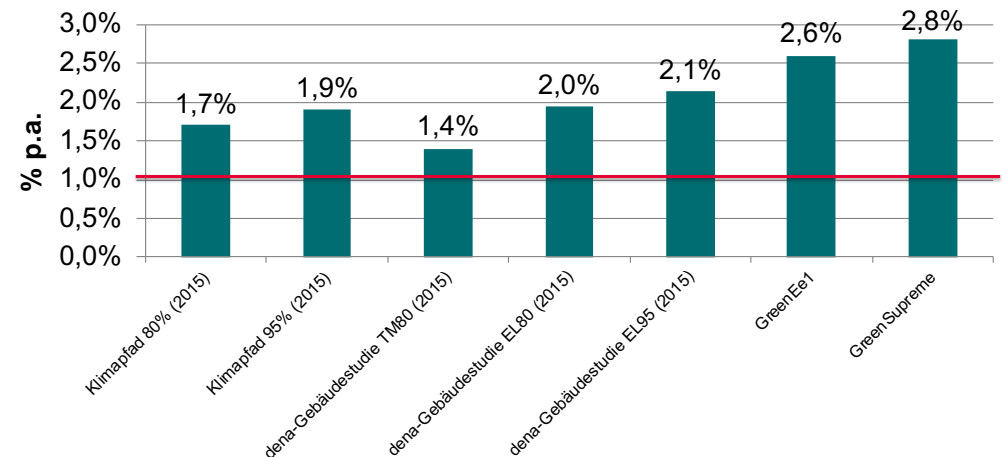
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## Final energy demand German building stock



Dena 2019, p 34

## Refurbishment rate



**Are tenants willing to pay a premium for energy efficiency?**



Review of 20+ international studies on green premiums:

- Most studies identify price premiums for energy efficiency in the residential sector & larger premiums in the sales market than in the rental market
- → **Common view: energy efficiency is clearly rewarded in the market**



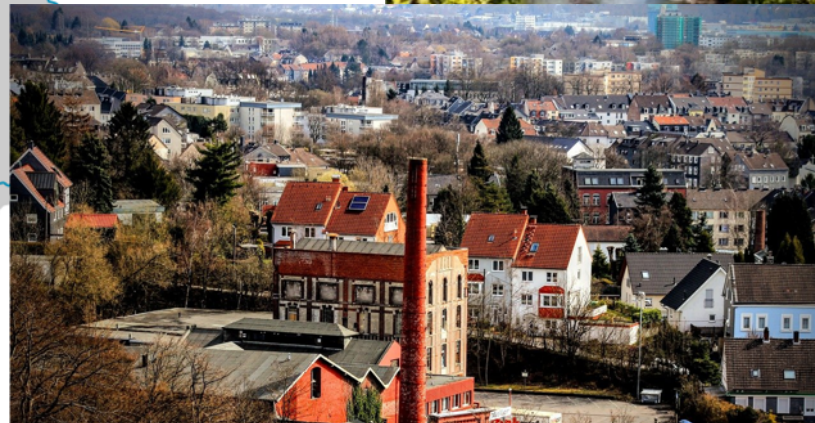
- **But not all studies identify price premiums**
  - Other criteria (e.g. location, neighbourhood) play a greater role
  - Large variability in estimates, even within a single geographical context
  - Many conventional hedonic modelling approaches do not account for spatial dependence
- **Spatial analyses show more differentiated picture**
  - Taltavull et al., 2017 – Bucharest:
    - Conventional hedonic analysis: predicted 3.5% premium
    - Spatial analysis: premium varied across neighbourhoods (e.g. North: 6.5%; West: 2.2%; no significant premiums identified elsewhere)

## Research Gap:

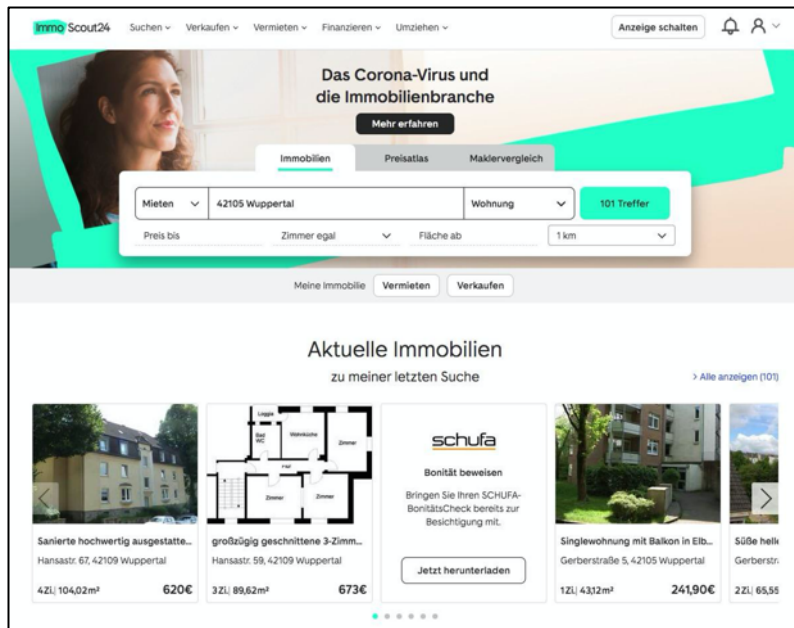
- → Small-scale spatial approaches and analyses are needed
- → Present study: first city-level spatial analysis in Germany

# Data and methodology

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## 1. Hedonic apartment characteristics (Immoscout 24 database)

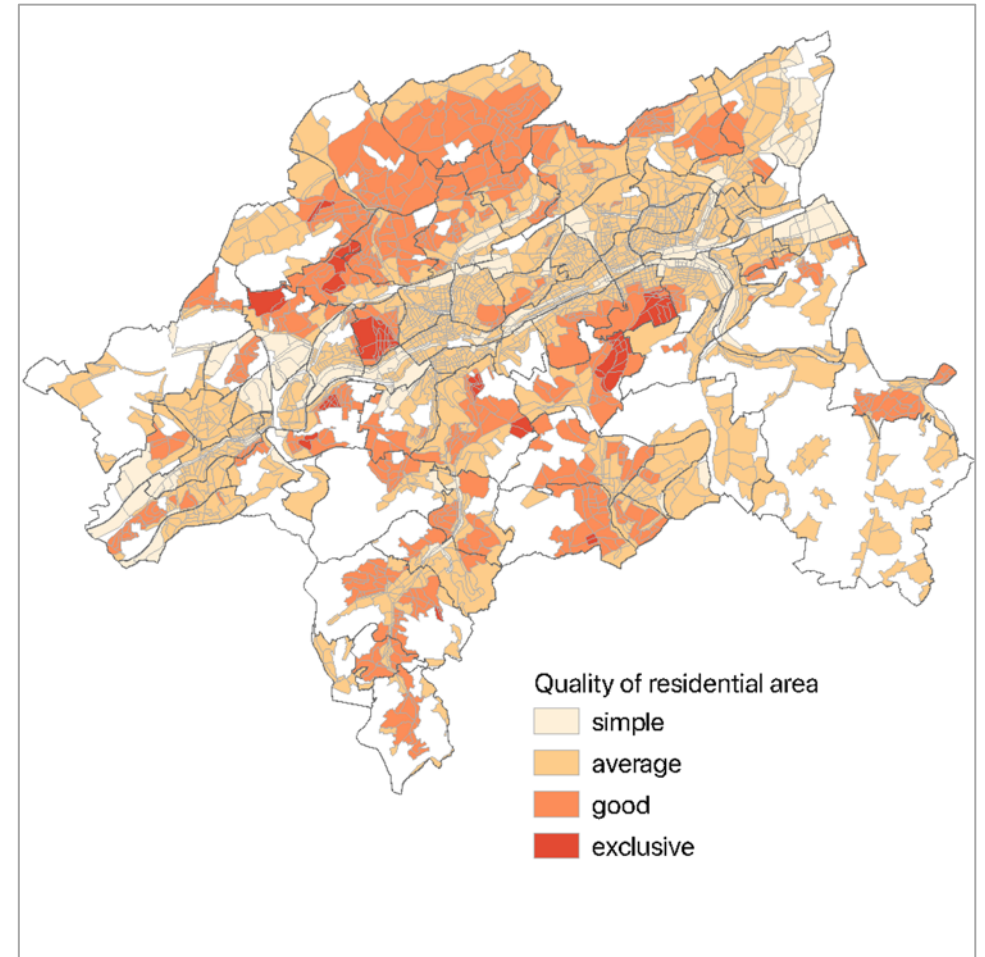
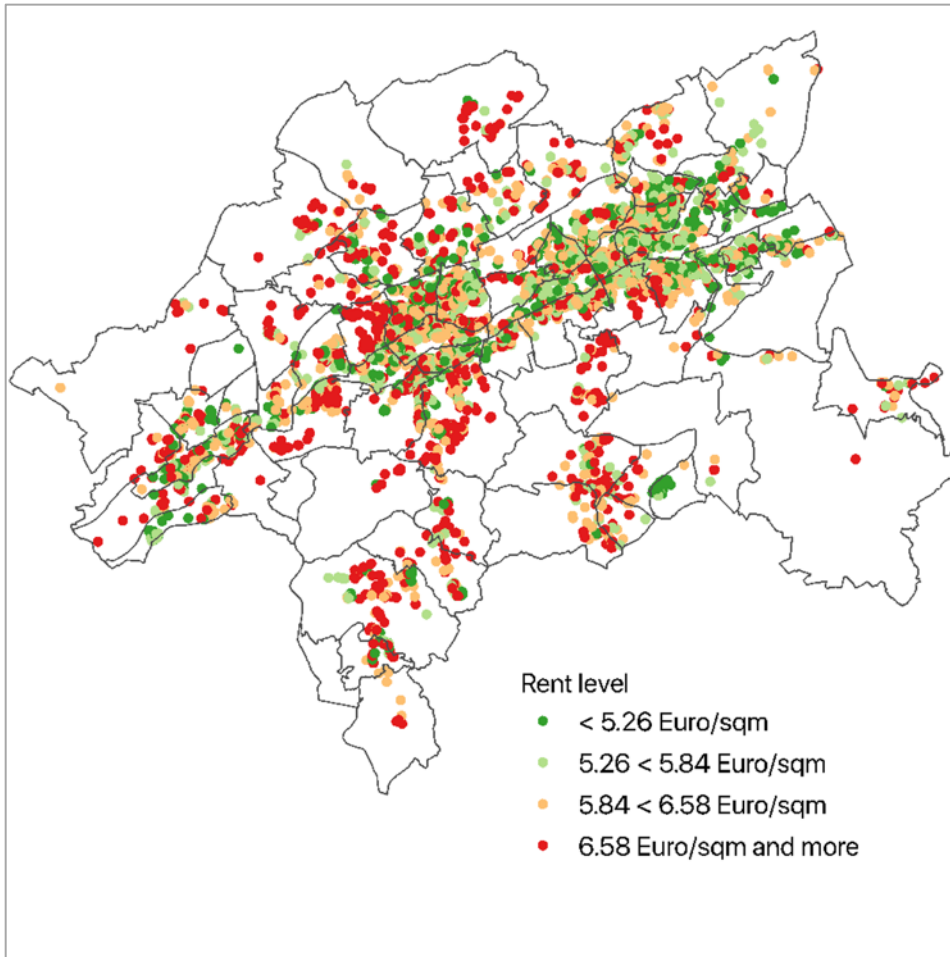
- Germany's largest real estate platform
- Georeferenced data from 2012-2019
- Large set of hedonic variables, including:
  - energy efficiency performance (Energy performance certificate)
  - rental price
  - apartment characteristics, e.g. fitted kitchen, balcony, guest toilet
- Approx. 12,300 entries

## 2. Neighbourhood characteristics (City of Wuppertal; ALKIS property register)

- Sociodemographic + socio-economic statistics on building block level, e.g. unemployment rate, population density
- Data on the settlement structure, e.g. share of traffic area, recreational area
- Quality of residential area (simple, average, good, exclusive)



**City of Wuppertal**



## Spatial Autocorrelation and Spatial Regression

**„All things are related, but nearby things are more related than distant things“**

Tobler's first law of geography

Would you pay the same rent for an identical apartment if it is situated...



$$\ln(\text{price}_i) = \alpha + \beta E E_i + \gamma H_i + \delta N_i + \mu T_i + \mathbf{u}_i$$

$$u_i = \lambda w^i * u_j + \varepsilon_i$$



Rental (€)  
price per sqm

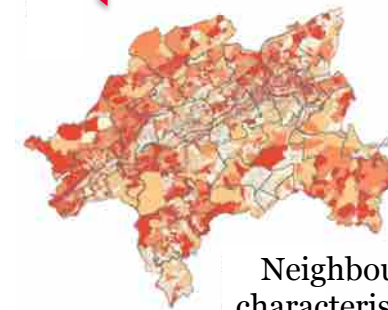
Constant



Energy performance of the  
apartment based on EPC  
measured in kWh/sqm\*a



Housing/apartment  
characteristics (e.g. floor,  
fitted kitchen, building  
age, living space, etc.)



Neighbourhood  
characteristics (e.g.  
population density,  
unemployment rate, etc.)

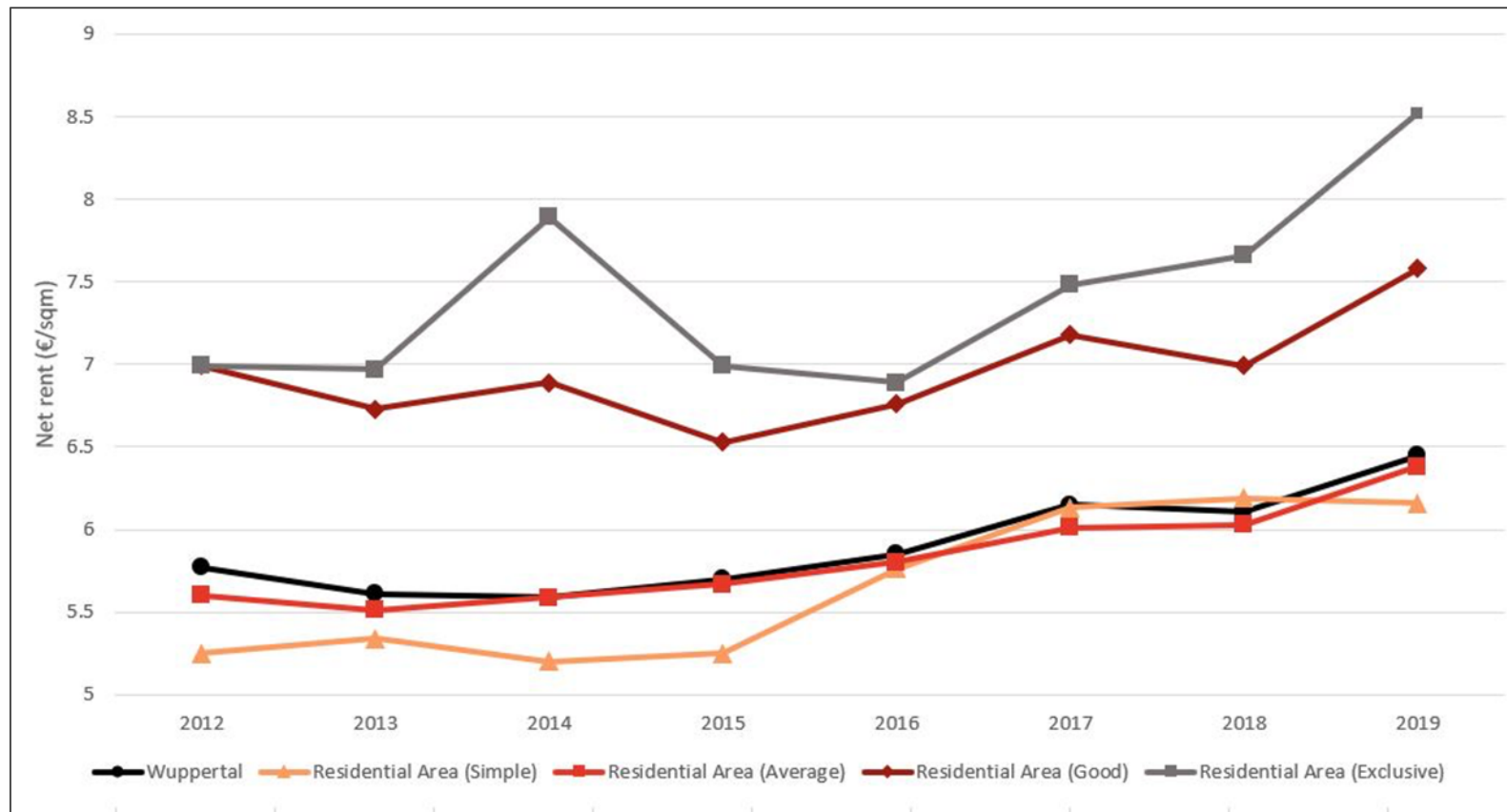


Time Dummy

# Results

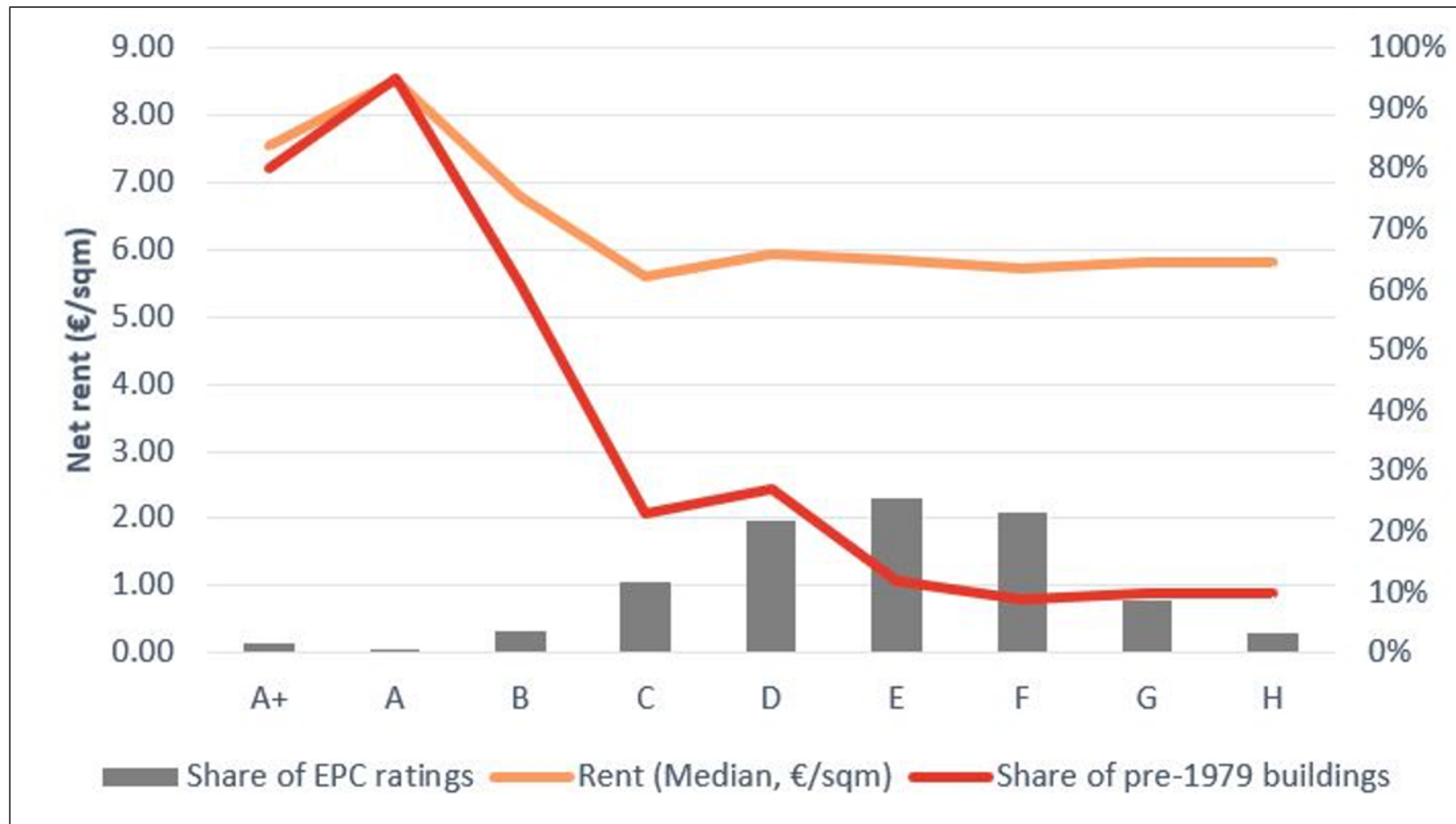
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## Median rent level development 2012-2019 in Wuppertal and in different residential locations





## Median rent level depending on the EPC rating



# Results

## Overall Regression

	OLS		SEM	
	<i>Coefficient</i>	<i>Standard Error</i>	<i>Coefficient</i>	<i>Standard Error</i>
(Intercept)	1.98468384 ***	0.097687	1.933182 ***	(0.049316)
Energy Performance	-0.00007408 ***	0.000022	-0.000166 ***	(0.000023)
N	12232		12232	
F / Likelihood Ratio (LR)	283.00 ***		3263.20 ***	
Adjusted / Pseudo R <sup>2</sup>	0.452		0.611268	
AIC	-19535		-22796.12	

Note: \* p < 0.05; \*\* p < 0.01; \*\*\* p < 0.001; Heteroscedasticity-consistent standard errors are shown for the OLS regression

→ the willingness to pay increases by 0.017% for each improvement in energy efficiency of 1 kWh/sqm\*a

### Key results:

- WTP among tenants exists
- WTP higher for more visible apartment features
- No evidence of easier re-letting

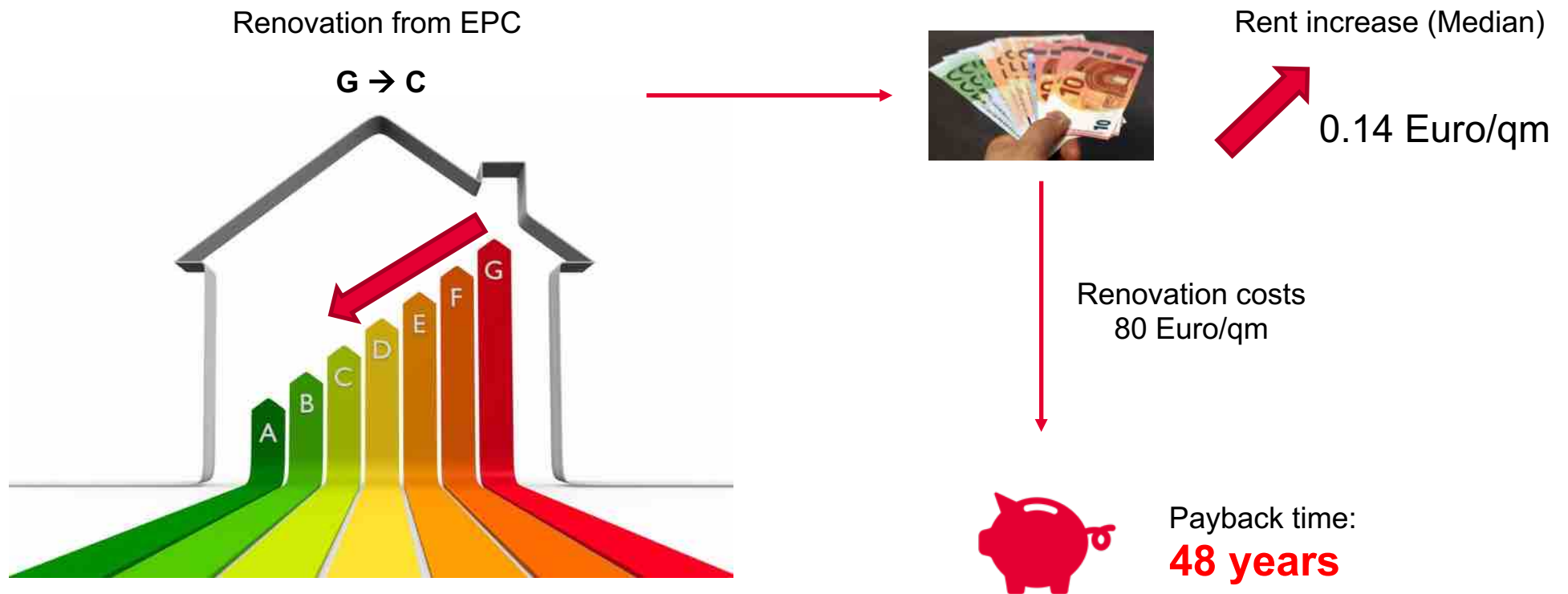
### But:

→ Energy efficiency investments barely economically viable for landlords



# Results

## Overall Regression



# Results

## Regression by residential area quality

	Simple	Average	Good	Exclusive
<b>Energy Performance</b>	<b>0.00014 *</b>	<b>-0.00019 ***</b>	<b>-0.00029 ***</b>	<b>-0.00026</b>
	(0.00006)	(0.00005)	(0.00008)	(0.00023)
Apartment characteristics	✓	✓	✓	✓
Neighbourhood characteristics	✓	✓	✓	✓
Time	✓	✓	✓	✓
Lambda	0.58003 ***	0.67856 ***	0.56532 ***	0.33045 ***
	(0.02869)	(0.01068)	(0.02267)	(0.08422)
N	1545	9260	1260	155
(Pseudo) R2	0.61411	0.57407	0.68705	0.67343
AIC	-2954.57772	-18031.03925	-2243.33783	-255.43674

\*\*\* p < 0.001; \*\* p < 0.01; \* p < 0.05.

# Discussion & Policy Implications

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1. Visible investments are preferred and yield a higher expected return than energetic refurbishment measures  
→ Other financing concepts needed (e.g. refurbishment obligation)



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6. ... but need to be considered within the context of urban development policy to avoid energy-related gentrification and social segregation

**Thank you**  
**for your attention**

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