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Residential migration and the Covid-19 crisis: Towards an urban exodus in France?¹

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Context I				

Urban exodus, a popular topic in the press:

Since the beginning of the crisis we hear about attractiveness of:

- less dense areas
- large green spaces, bigger homes...

Yet, this is not a new phenomenon

- 57% of people living in urban areas wanted to leave them (IFOP, 2019²)
- Main obstacles: lack of services (for 60%), lack of transport infrastructures (for 53%) and difficulties in accessing employment (for 46%)

Increase of remote work

^{2.} https://www.ifop.com/publication/le-retour-a-la-campagne/

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Context II				

Changes in the rural real estate market:

- $\bullet\,$ Transaction volumes in rural areas have increased by 13 $\%\,$ since March 2020 $^3\,$
- Increase in prices

	1 year	2 years	5 years	10 years
Paris	-2%	-3.2%	19.9%	21.6%
10 largest cities	3.5%	10%	35.1%	36.8%
50 largest cities	3.5%	10%	28.9%	24.3%
Rural Areas	7.9%	11.9%	17.1%	5.8%
France	5%	10.3%	22.1%	16.4%

Table - Real Estate prices evolution in March 2022 - Meilleurs Agents

Do we face an urban exodus?

^{3. 2021} Meilleurs Agents Press Conference: "Quelles sont les nouvelles tendances pour le marché immobilier?"

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Goal of th	nis paper			

Provide some early answers to establish whether the Covid-19 crisis has modified the intentions of French residents to move

thanks to original data based on users' behaviour on the Meilleurs Agents website

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Literature

Discrete Choice Models

McFadden (1978), Train (2003), Aissaoui (2016), ...

Household location choices

Trade-off between prices and accessibility to employment

Waddell (1993); Srour et al. (2002); Rivera and Tiglao (2005); Cornelis et al. (2012); Ettema (2010)

Spatial and social amenities

Pinjari et al. (2009); Kim et al. (2005); Bayoh et al. (2006); Zondag and Pieters (2005); Filion et al. (1999); Gueymard (2006); De Palma et al. (2005, 2007); Goffette-Nagot and Schaeffer (2013)

Household characteristics

Waddel (1993); Walker and Li (2007); Habib and Miller (2007)

Covid-19 crisis

Ramani and Bloom (2021), Brueckner et al. (2021)

Contribution

- First study about the consequences of Covid-19 on residential mobility in France
- Use of original data from traffic on the Meilleurs Agents platform

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Platform Data Description

Meilleurs Agents

- Leader in online real estate estimates and information in France
- Attracts 2.4 million unique visitors per month
- 500,000 online estimates per month

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Mobility Path using data from Estimate tool

Owner Estimation Principal residence Origin City

 \longleftrightarrow

Buyer Estimation Searched residence Destination City

- User's status: Owner or Buyer
- Estimation date
- Dwelling characteristics
- Dwelling location

96,807 links between an estimation of a principal residence owned and a dwelling searched for **77,709** different users

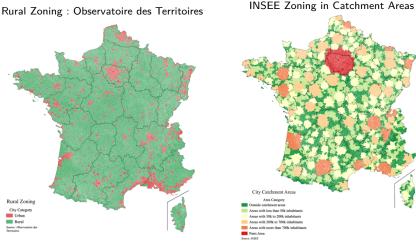
	Evolu	ution du prix du bien
•		
faison		
0 Rue du Château, 4400	0 Nantes	
60 m2 3 pièces		
	Estimation net vendeur	
Estimation basse	Estimation moyenne	Estimation haute
240 000 €	250 000 €	260 000 €
	Indice de confiance	

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Platform	data proces	ssing		

- Keep buyer estimates from January 1, 2019, to September 20, 2021
- 2 Remove the outliers
- Account for multiple estimates by the same user
- Seep the owner-estimates done for principal residences
- Merge owner-estimates and buyer-estimates by user ID



Characteristics of the location

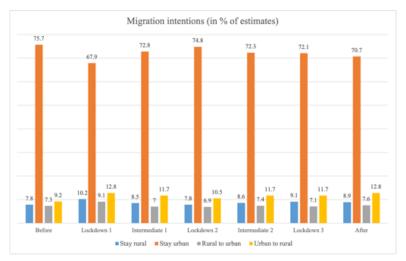


+ Socioeconomic data from INSEE about municipalities

Median population income, services and equipment levels, age distribution of the population and structure of the housing stock

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Descriptive Statistics



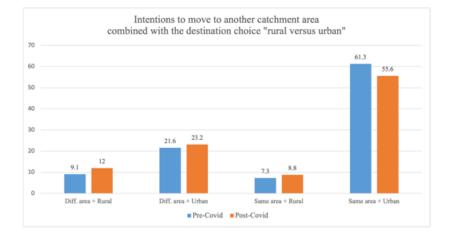
Before: 01/01/2019 to 11/03/2020 Lockdown 1: 12/03/2020 (announcement) to 10/05/2020 Intermediate 1: 11/05/2020 to 27/10/2020

Lockdown 2: 28/10/2020 (announcement) to 15/12/2020 Intermediate 2: 16/12/2020 to 30/03/2021

Lockdown 3: 31/03/2021 (announcement) to 02/05/2021 After: 03/05/2021 to 20/09/2021

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Descriptiv	A Statistics	-		







Has the Covid-19 crisis modified the residential location behavior of French people?

For two sub-samples : urban resident and rural resident

- 1. Logit Models
- \rightarrow Probability of staying in the same catchment area
 - \rightarrow Probability of choosing an urban destination
- 2. Nested Logit Model

 \rightarrow Intentions of residents to move from a set of mutually exclusive alternatives and allowing certain alternatives in the choice set to be correlated

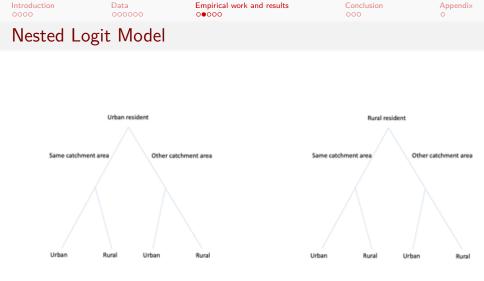


Figure – Diagram of decision tree

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Results : probability of staying in the same catchment area

Table – Logit estimation results; Odds Ratios

Dependent van	iable: probability	of staying in the s	same catchment ar
Urban origin		Rural origin	
0.868***		0.916**	
(0.019)		(0.036)	
	0.933		0.939
	(0.059)		(0.100)
	0.916***		0.948
	(0.026)		(0.050)
	0.940		0.990
	(0.069)		(0.134)
	0.869***		0.977
	(0.029)		(0.055)
	0.933		0.875
	(0.047)		(0.087)
			0.858***
	(0.026)		(0.048)
Yes	Yes	Yes	Yes
81,646	81,646	15,161	15,161
-36,247.950	-36,232.510	-9,543.136	-9,540.378
72,611.900	72,591.020	19,152.270	19,156.760
	Urban 0.868*** (0.019) Yes 81,646 36,247,950	Urban origin 0.868*** (0.019) 0.933 (0.059) 0.916*** (0.026) 0.940 0.069) 0.869*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.933 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.792** (0.029) 0.793 (0.047) 0.791*** (0.029) 0.793 (0.047) 0.792** (0.029) 0.793 (0.047) 0.791*** (0.025) 0.792** (0.025) 0.793 (0.047) 0.791*** (0.025) 0.793 (0.047) 0.791*** (0.025) 0.793 (0.047) 0.791*** (0.025) 0.792** (0.025) 0.792** (0.025) 0.793 (0.047) 0.792** (0.025) (0.025)	Urban origin Rut 0.868*** 0.916** (0.019) 0.933 (0.059) 0.916*** (0.069) 0.940 0.940 0.069) 0.933 (0.026) 0.940 0.933 (0.029) 0.933 (0.047) 0.791*** (0.026) Yes Yes Yes 81,646 81,646 15,161 -36,247.950 -36,232.510 -9,543.136

POST-COVID, the probability of searching in the same catchment area is

- 0.868 times lower for urban residents
- 0.916 times lower for rural residents

Particularly significant decrease after the end of the 3rd confinement

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Results : probability of choosing urban over rural

Table – Logit estimation results; Odds Ratios

	Dependent variable: choose urban over rural			
	Urban	origin	Rural	origin
search_after_covid	0.911**		1.041	
	(0.044)		(0.070)	
covidconf1		0.887		1.293
		(0.126)		(0.192)
covidinter1		0.959		0.982
		(0.060)		(0.100)
covidconf2		1.110		1.140
		(0.167)		(0.270)
covidinter2		0.909		0.998
		(0.067)		(0.108)
covidconf3		0.916		0.882
		(0.104)		(0.167)
covidafter		0.857***		1.138
		(0.060)		(0.097)
Controls	Yes	Yes	Yes	Yes
Observations	81,646	81,646	15,161	15,161
Log Likelihood	-36,247.950	-36,232.510	-9,543.136	-9,540.378
Akaike Inf. Crit.	72,611.900	72,591.020	19,152.270	19,156.760
Note:	*p<0.1; **p<0.05; ***p<0.01			05; ***p<0.01

POST-COVID, the probability of searching in urban (versus rural) is:

- 0.911 times lower for urban, with an even larger effect after the end of the 3rd confinement
- NS different for rural

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Results : Nested Logit Model

	Dep. variable:	staying in the san	ne attraction area a	nd choosing urban over rur
	Urban	origin		Rural origin
earch_after_covid:diff_aav_urb	0.915		0.975	
	(0.091)		(0.069)	
earch_after_covid:same_aav_rur	0.848***		0.901**	
	(0.057)		(0.048)	
earch_after_covid:same_aav_urb	0.802**		0.926	
	(0.089)		(0.071)	
covidconf1:diff_aav_urb	(,	0.859	()	1.406*
		(0.261)		(0.182)
covidconf1:same_aav_rur		0.953		1.064
		(0.162)		(0.133)
covidconf1:same_aav_urb		0.788		1.110
		(0.253)		(0.195)
:ovidinter1:diff_aav_urb		0.942		0.957
Lovidinter1.din_aav_urb		(0.124)		(0.097)
:ovidinter1:same_aav_rur		0.862*		0.918
tovidinter1.same_aav_rui		(0.077)		(0.066)
covidinter1:same aav urb		0.872		0.930
Lovidinter1.same_aav_drb				
		(0.120)		(0.100)
covidconf2:diff_aav_urb		0.981		0.969
		(0.325)		(0.252)
:ovidconf2:same_aav_rur		0.622**		0.827
		(0.220)		(0.176)
:ovidconf2:same_aav_urb		0.997		1.238
		(0.314)		(0.250)
:ovidinter2:diff_aav_urb		0.904		0.903
		(0.137)		(0.106)
:ovidinter2:same_aav_rur		0.865*		0.916
		(0.087)		(0.073)
:ovidinter2:same_aav_urb		0.795*		1.001
		(0.133)		(0.111)
:ovidconf3:diff_aav_urb		0.935		0.964
		(0.209)		(0.161)
covidconf3:same_aav_rur		1.029		0.882
		(0.132)		(0.114)
covidconf3:same aav urb		0.856		0.915
		(0.203)		(0.176)
ovidafter:diff aav urb		0.909		1.000
		(0.120)		(0.094)
:ovidafter:same_aav_rur		0.811***		0.873**
		(0.076)		(0.064)
:ovidafter:same_aav_urb		0.725***		0.848*
ordarecr.aamc_adv_brb		(0.117)		(0.098)
Controls	Yes	Yes	Yes	Yes
Observations	81.646	81.646	15.161	15.161
Log Likelihood	-36.247.950	-36.232.510	-9.543.136	-9.540.378

The probability that an urban resident will remain in the same AAV, rather than rural in another AAV, is:

- 0.848 times lower for a rural destination
- 0.802 times lower for an urban destination

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Conclusion				

Thanks to user's behaviour data on platform Meilleurs Agents, we show that since the beginning of the Covid-19 crisis:

- French residents search moving further, i.e. in another catchment area
- **2** Urban French residents search more in rural areas
- Urban French residents search more in rural areas in another catchment area

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Limits				

- We can't study the intentions to move of all French population (renters, first-buyers)
- Traffic on the Meilleurs Agents website varies over time and across the French territory which can create an issue of representativity
- We do not observe households characteristics that matter in location choices

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Next				

- Carrying out an inference causal analysis of Covid-19
- Better characterizing changes in the intentions to migrate using a gravity model
- Going further than urban/rural gradient by introducing more spatial heterogeneity

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Thank you!