

Intergenerational mobility across origins in France: The role of residential segregation

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Remaining questions:

- Do 2nd gen. earn less **only due to intergenerational persistence?**
- Or do they still earn less **conditional on parents' income?**
- If so, could **residential segregation** be at play?

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- **effect** on sons of natives, larger on sons of North Afr. parents

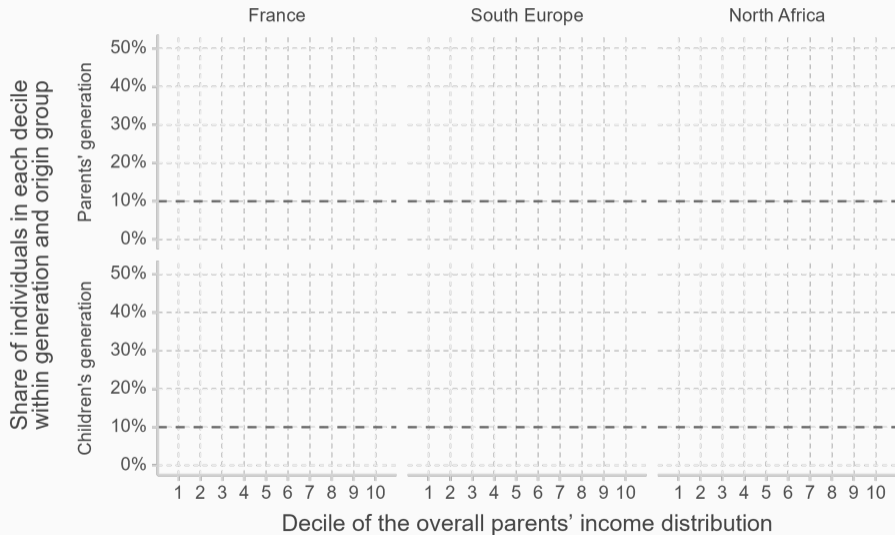
→ Hence contributing to the conditional income gap

Intergenerational mobility across origins

Income distributions across origins

origins

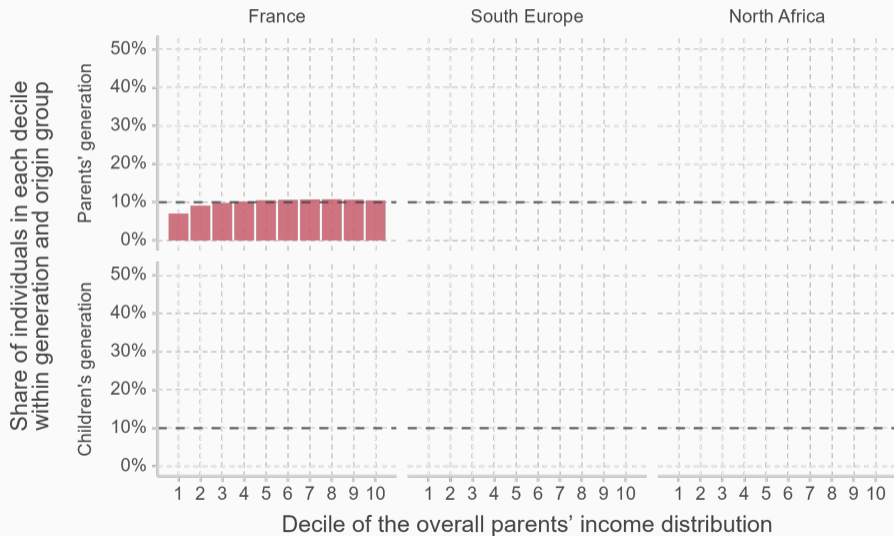
mixed



Income distributions across origins

origins

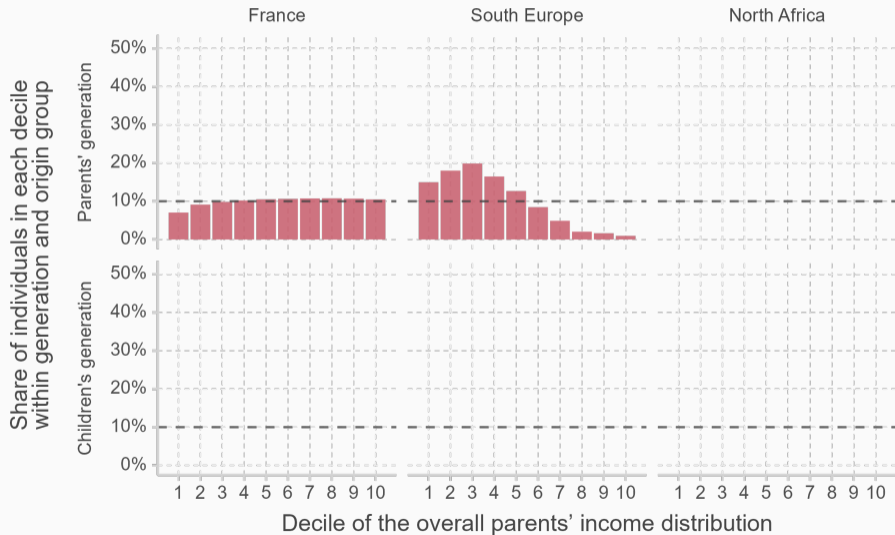
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Income distributions across origins

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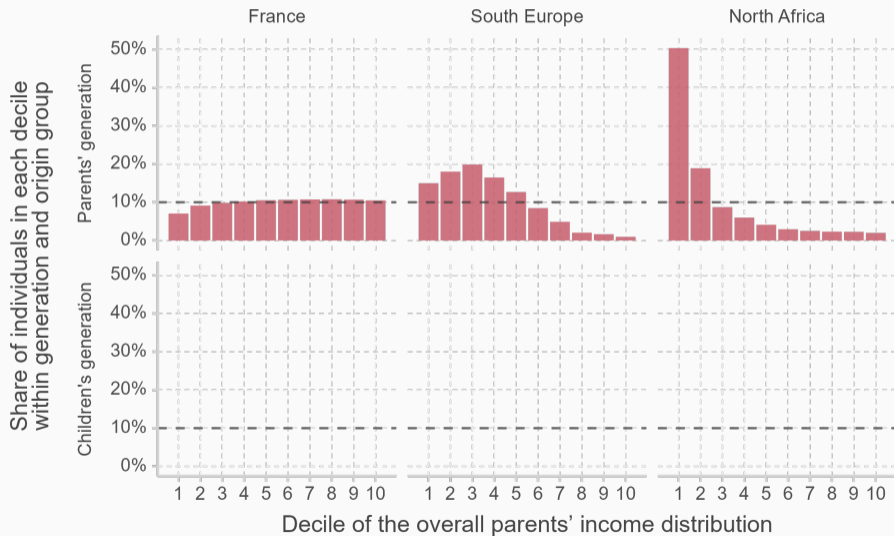
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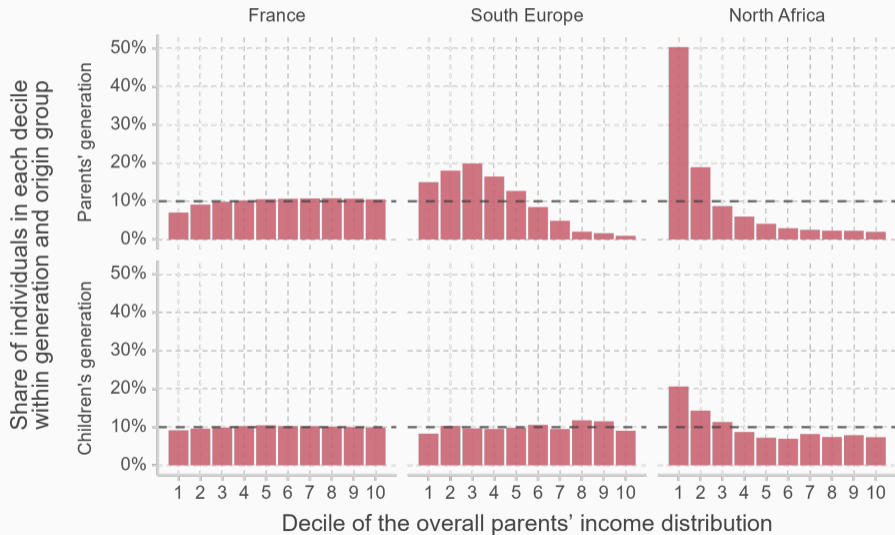
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Income distributions across origins

origins

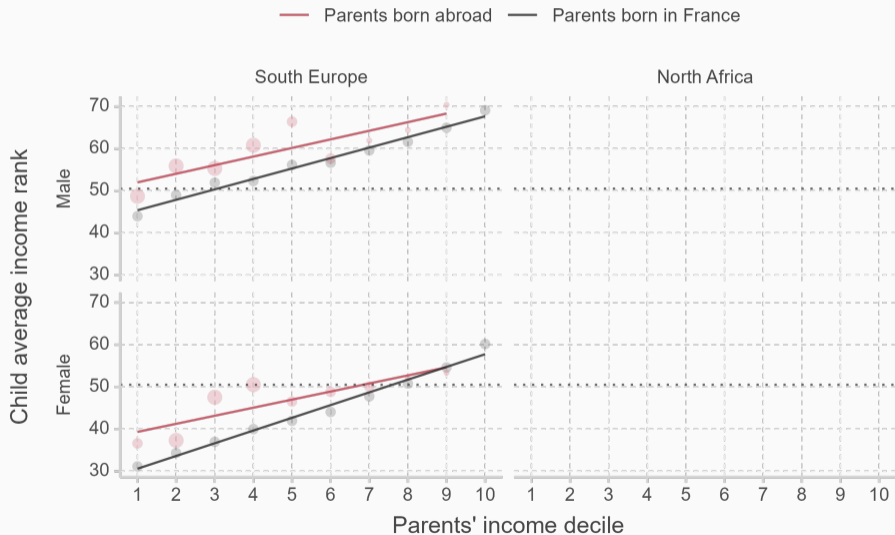
mixed



Conditional income ranks

lifecycle

attenuation

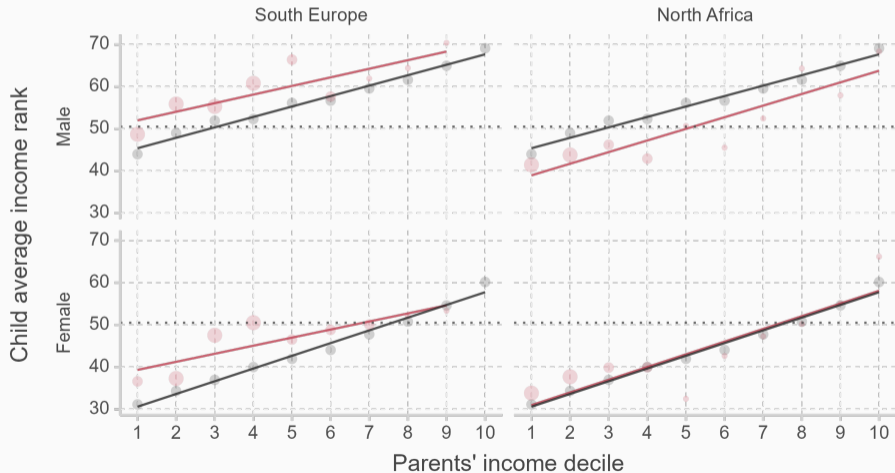


Conditional income ranks

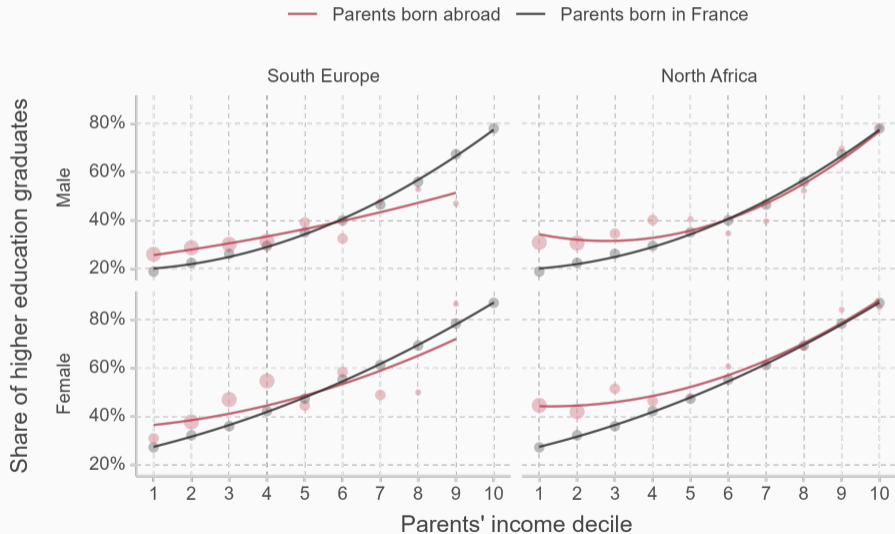
lifecycle

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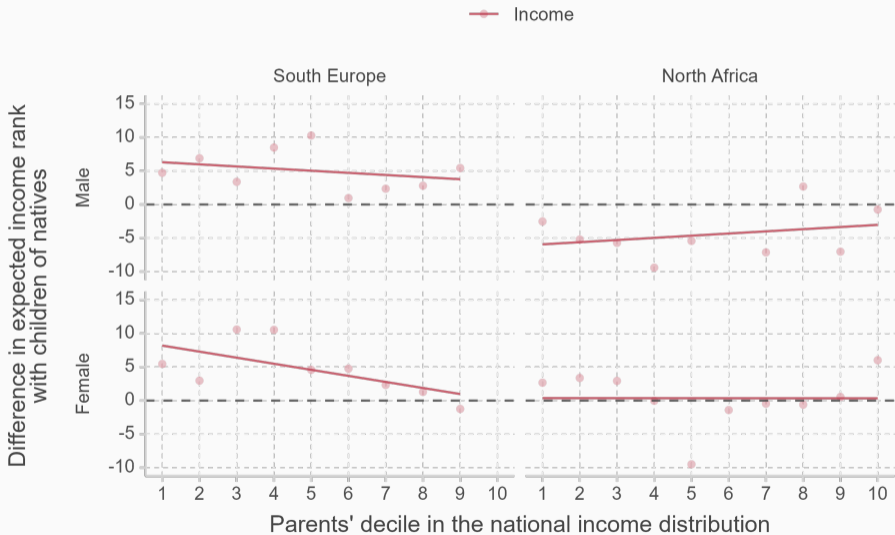
— Parents born abroad — Parents born in France



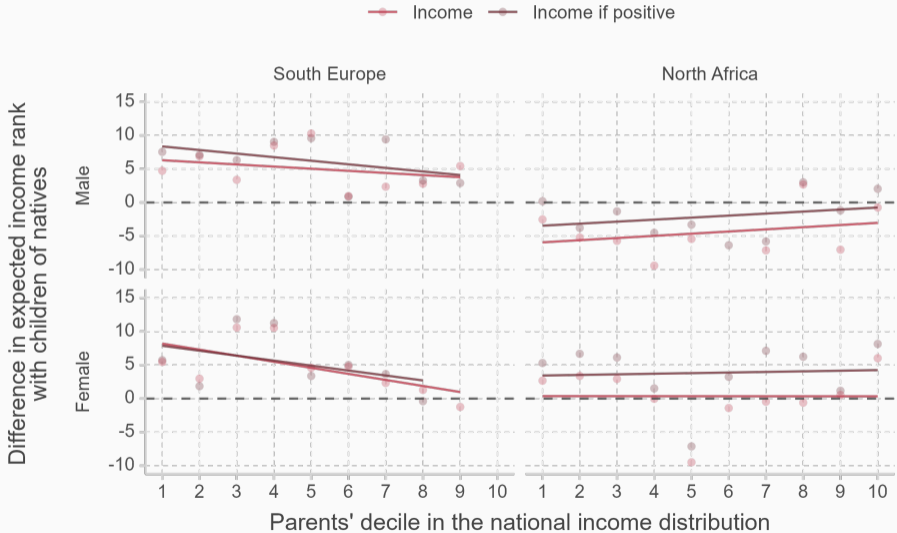
Conditional educational attainment masters



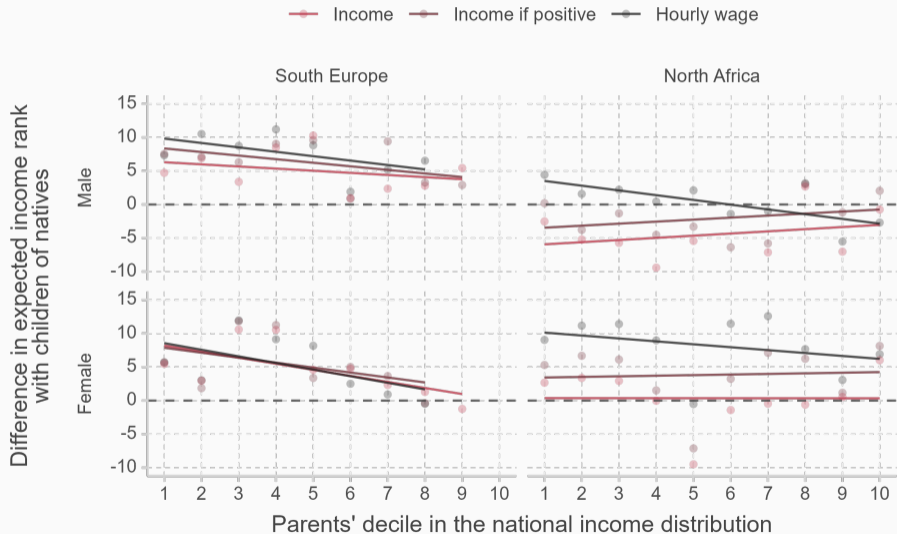
Conditional income difference



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Conditional income difference



Takeaways

Doesn't seem to be at play:

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- Hourly wage

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Hiring discrimination:

- *Well documented by correspondence testing*
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Residential segregation:

- *Less diversified network + feeling of exclusion*
- *Much easier to measure, and hence, to act on*

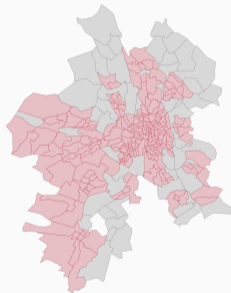
Residential Segregation

Spatial units

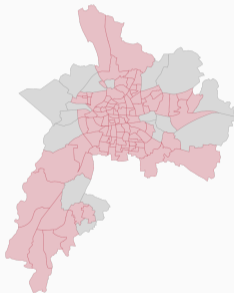
distributions

measurement

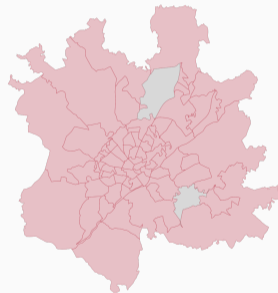
Toulouse



Rennes



Limoges



Housing neighborhood

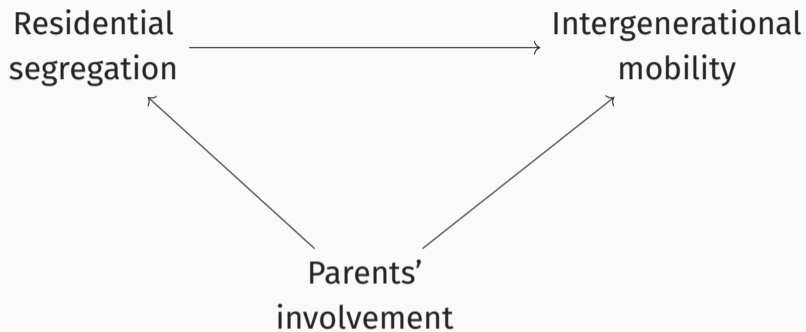


Other

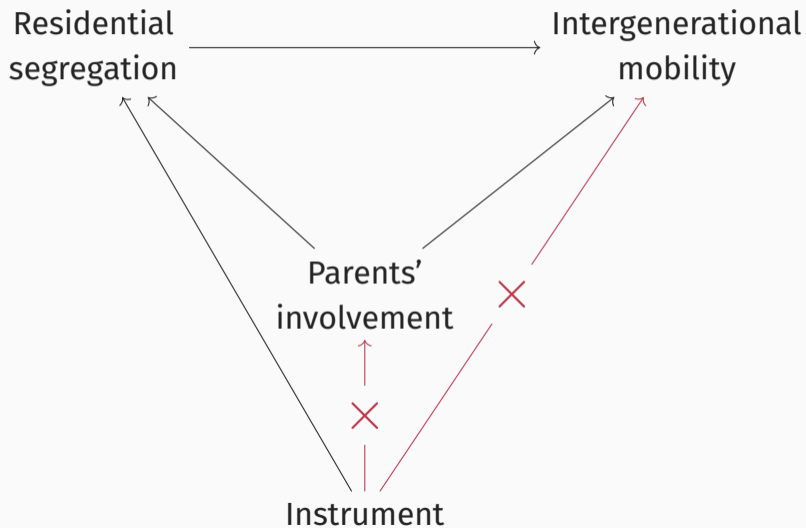
Identification strategy



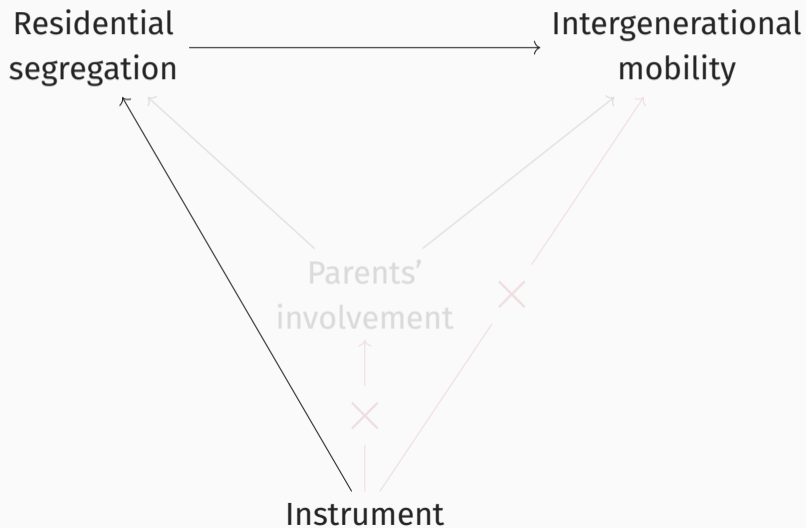
Identification strategy



Identification strategy



Identification strategy



Geographic barriers

national

index

distribution

Toulouse



Rennes



Limoges



Waterway

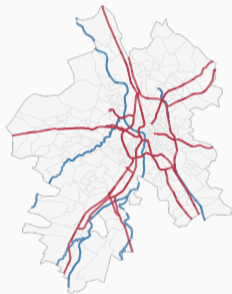
Geographic barriers

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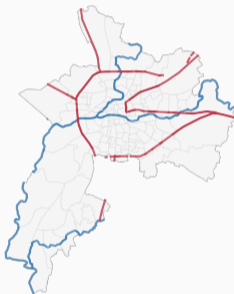
index

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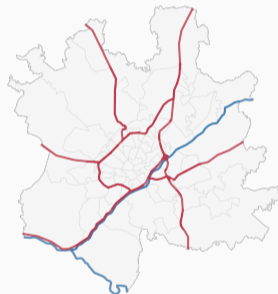
Toulouse



Rennes



Limoges



Waterway



Roadway

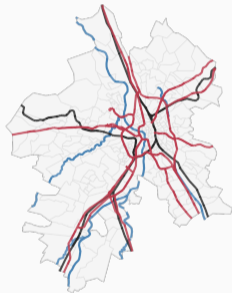
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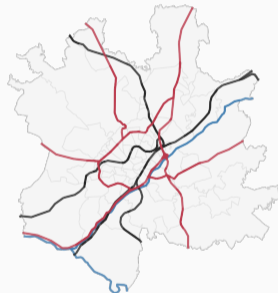
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Waterway



Roadway



Railway

Exclusion restriction

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What's left:

- \times **Neither whether or not** the urban units has rails or rivers
- \times **Nor how much** of these they have
- \checkmark **Only how** unevenly these features divide the area

First stage graph

	Segregation index				
Spatial division index	0.088*** (0.008)	0.072*** (0.008)	0.082*** (0.008)	0.082*** (0.008)	0.072*** (0.008)
Constant	0.157*** (0.004)	0.158*** (0.004)	0.158*** (0.004)	0.158*** (0.004)	0.157*** (0.004)
Waterway length		✓			✓
Railway length			✓		✓
Roadway length				✓	✓
Obs. (Urban units)	1,891	1,891	1,891	1,891	1,891
R ²	0.07	0.08	0.07	0.07	0.08
F-stat.	136.6	82.2	72.9	72.4	41.6

Second stage (males) naive threshold

	Small urban units			Large urban units		
	France	North Afr.	South Eu.	France	North Afr.	South Eu.
%Immigrants	-1.40 (1.323)	-0.88 (1.964)	2.90 (2.844)	1.68* (0.967)	5.16** (2.533)	-1.19 (2.514)
$\widehat{\text{Segregation}}$	-11.33 (13.666)	1.39 (14.665)	49.21 (30.384)	4.91 (3.806)	44.94* (23.573)	-6.32 (15.312)
%Imm. \times $\widehat{\text{Seg.}}$	0.39 (0.401)	0.29 (0.645)	-1.14 (0.983)	-0.68** (0.349)	-1.90** (0.905)	0.39 (0.946)
Parents' rank	0.26*** (0.017)	0.29** (0.135)	0.13 (0.166)	0.25*** (0.011)	0.27*** (0.065)	0.17*** (0.056)
Constant	70.67** (31.396)	43.88 (33.813)	-51.95 (67.250)	29.44** (12.217)	-88.38 (70.344)	70.91 (44.893)
Geo. vars length	✓	✓	✓	✓	✓	✓
Observations	8,529	476	271	15,120	1,750	708
F-stat. Seg.	31.61	3.17	3.63	440.80	24.17	21.56
F-stat. Seg. \times Imm.	420.21	3.91	14.97	265.55	24.19	13.33

Second stage (females) naive threshold

	Small urban units			Large urban units		
	France	North Afr.	South Eu.	France	North Afr.	South Eu.
%Immigrants	-3.23 (2.814)	-1.87 (1.372)	-2.09 (4.343)	1.03 (0.848)	1.15 (2.448)	-8.58 (7.493)
$\widehat{\text{Segregation}}$	-43.84 (34.780)	-20.62 (14.908)	14.96 (27.972)	4.28 (3.753)	7.03 (22.194)	-28.76 (38.264)
%Imm. \times $\widehat{\text{Seg.}}$	0.78 (0.782)	0.67 (0.504)	0.45 (1.425)	-0.42 (0.299)	-0.49 (0.877)	3.12 (2.780)
Parents' rank	0.24*** (0.039)	0.15* (0.085)	0.37*** (0.109)	0.31*** (0.010)	0.22*** (0.056)	0.07 (0.073)
Constant	130.97 (80.114)	81.40** (33.665)	15.67 (64.503)	14.12 (12.202)	14.14 (65.931)	114.12 (105.231)
Geo. vars	✓	✓	✓	✓	✓	✓
Observations	8,392	445	241	14,896	1,699	605
F-stat. Seg.	31.61	3.17	3.63	440.80	24.17	21.56
F-stat. Seg. \times Imm.	420.21	3.91	14.97	265.55	24.19	13.33

Conclusion

Wrap up

Large income gaps among 1st generation immigrants

→ *50% of parents born in North Africa in the 1st decile*

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Conditional income gap only for males of North African origin

→ *Not driven by conditional education differences*

→ *Disappears in terms of hourly wage*

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Large income gaps among **1st generation** immigrants

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Negative effect of segregation on conditional income rank

→ Only in **large urban units** (i.e., $\geq 50k$ inhab.) and among **sons**

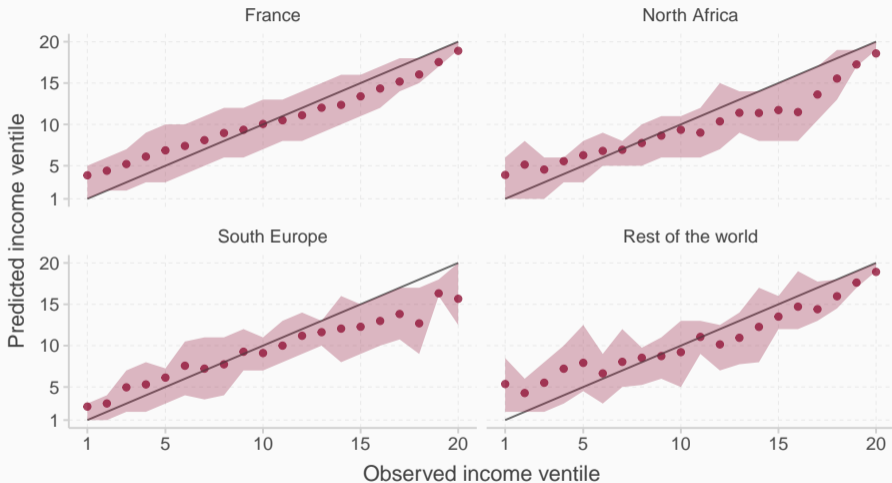
→ **Larger for North Afr.** than native origins → ↗gap

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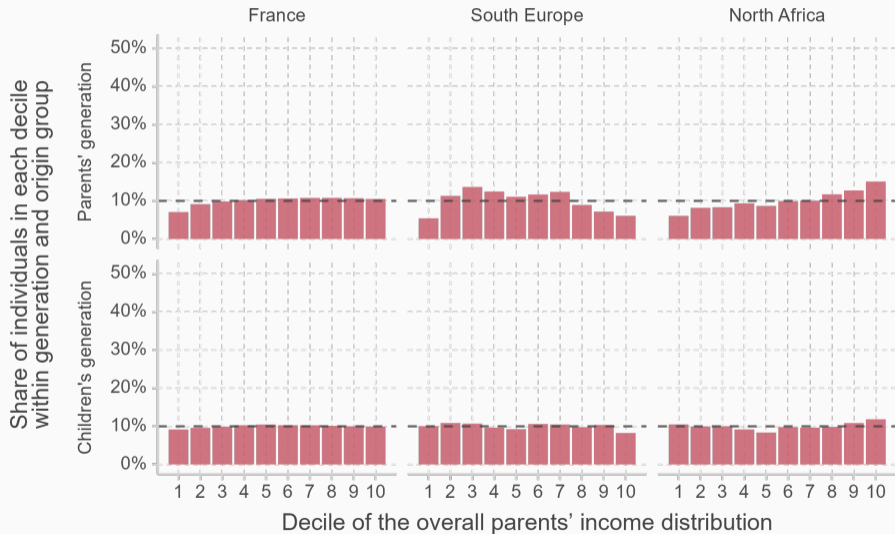
Out of sample predictions of income rank [back](#)



Distribution of origins [back](#)

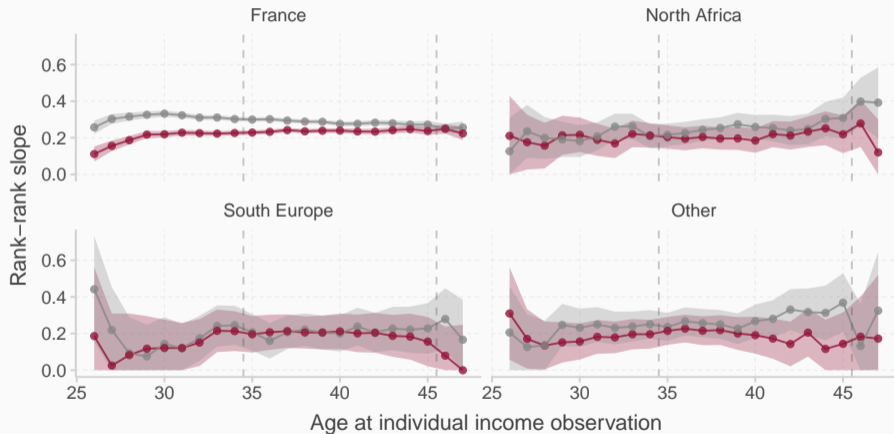
	Mother's place of birth					
↓ Father's	France	North Africa	South Europe	Other	Absent	Total
France	70.14	1.98	1.05	1.23	1.03	75.43
North Afr.	2.92	4.83	0.12	0.08	0.10	8.05
South Eu.	1.49	0.10	2.30	0.04	0.04	3.96
Other	1.23	0.08	0.03	1.35	0.04	2.73
Absent	8.56	0.69	0.25	0.33	-	9.83
Total	84.34	7.68	3.74	3.04	1.20	100

Income distributions across origins [back](#)

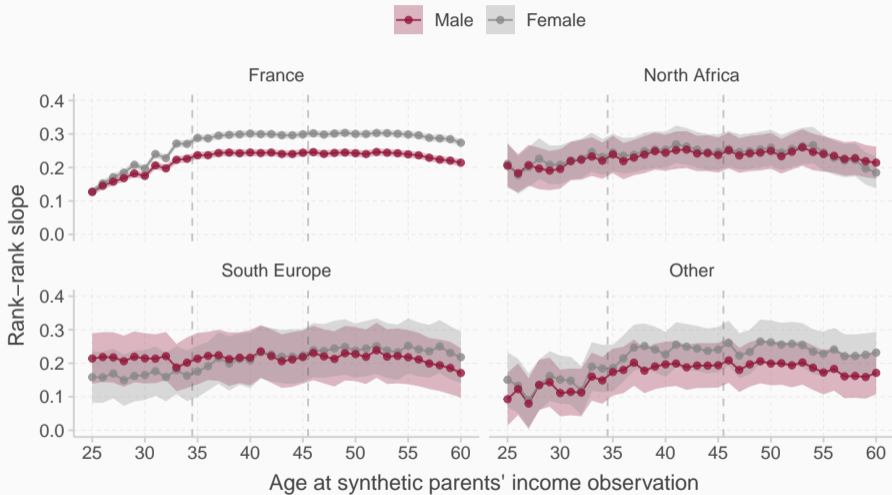


Lifecycle bias (children) [back](#)

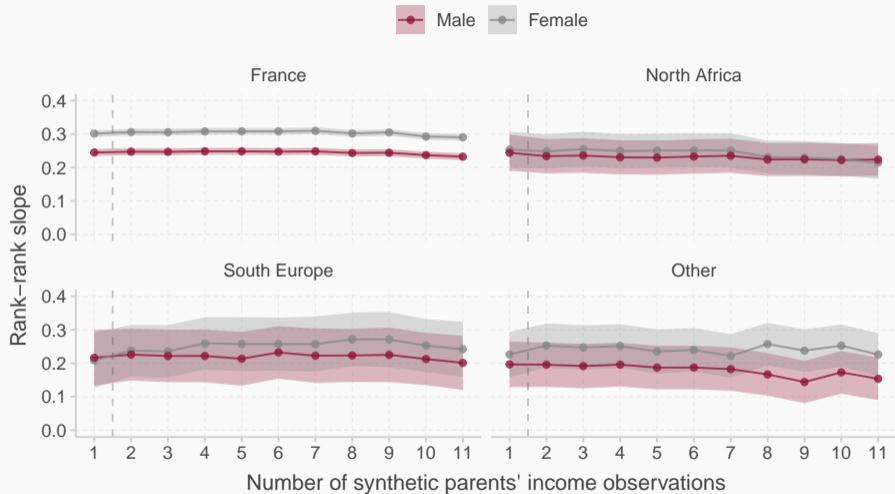
Male Female



Lifecycle bias (parents) [back](#)

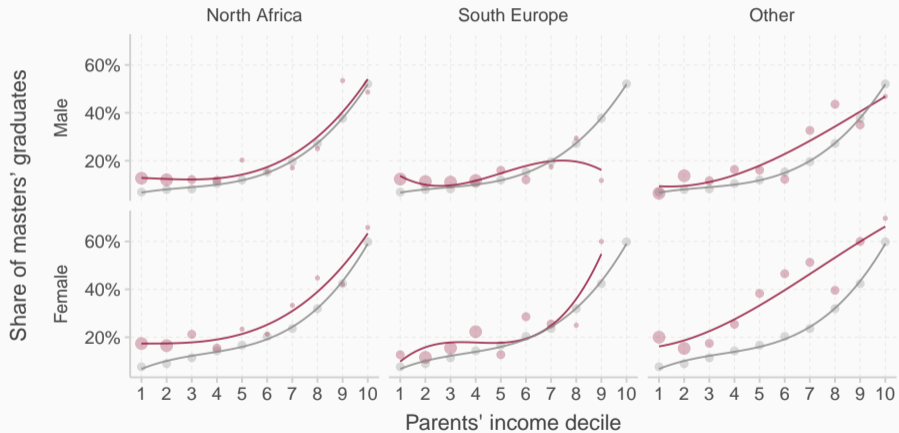


Attenuation bias [back](#)

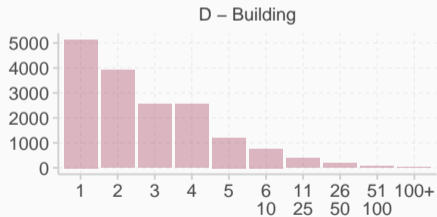
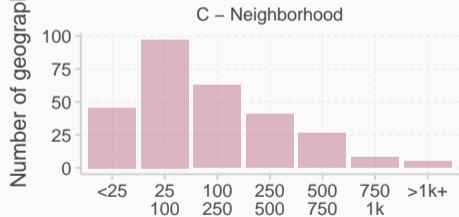
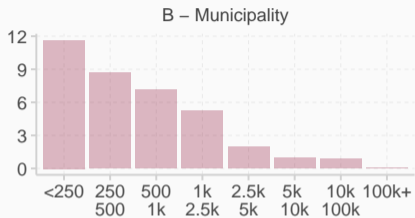
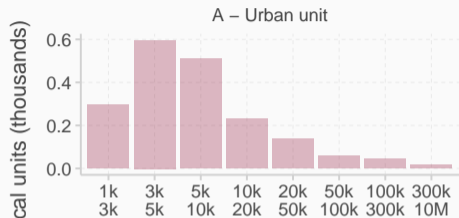


Conditional educational attainment (masters) [back](#)

— Parents born abroad — Parents born in France • < 5% • 5–15% • > 15% from decile



Population distribution across zonings [back](#)



Number of inhabitants in the geographical unit

Measurement [back](#)

U: Urban unit [map](#)

- *Contiguously built-up area of at least 2k inhabitants*
- *≈2,000 UU, 74% of population, 15% of municipalities*

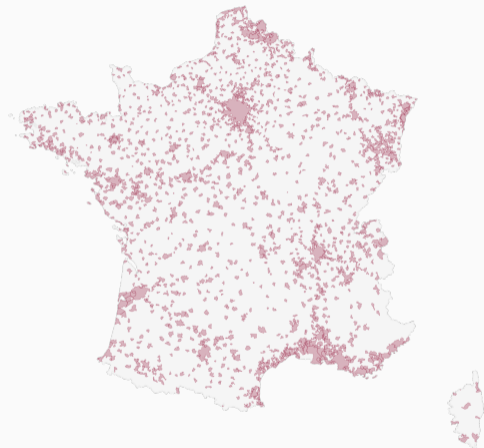
n: Neighborhood [map](#)

- *Statistical units in municipalities $\geq 5k$ inhabitants*
- *From few 100s to few 1,000s inhabitants*

Duncan Dissimilarity Index: [map](#)

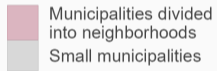
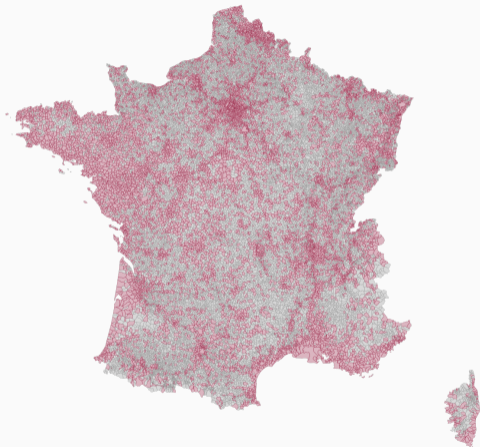
$$S_U = \frac{1}{2} \sum_{n=1}^N \left| \frac{\text{Imm}_n}{\text{Imm}_U} - \frac{\text{Nat}_n}{\text{Nat}_U} \right| \in [0, 1]$$

Urban units [back](#)

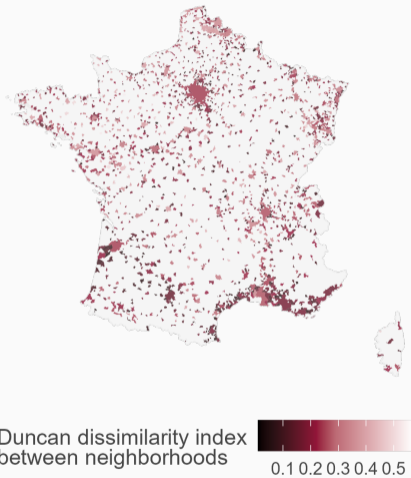


Neighborhoods

[back](#)

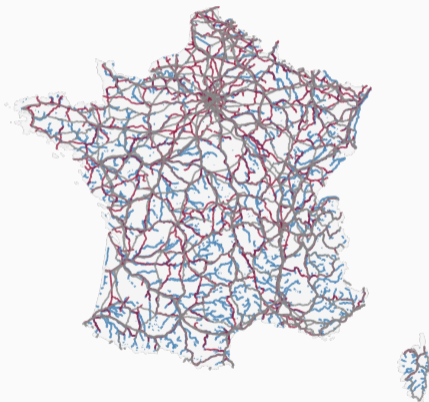


Residential segregation [back](#)



Geographic barriers [back](#)

— Railway — Roadway — Waterway



Instrument variable [back](#)

$$\text{Division index}_U = 1 - \sum_{s=1}^S \left(\frac{\text{area}_s}{\text{area}_U} \right)^2 \in [0, 1]$$

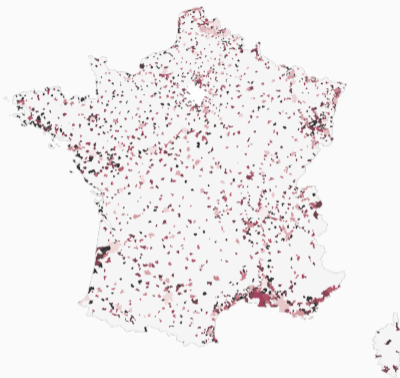
$$\text{with } \sum_{s=1}^S \text{area}_s = \text{area}_U$$

Higher index if:

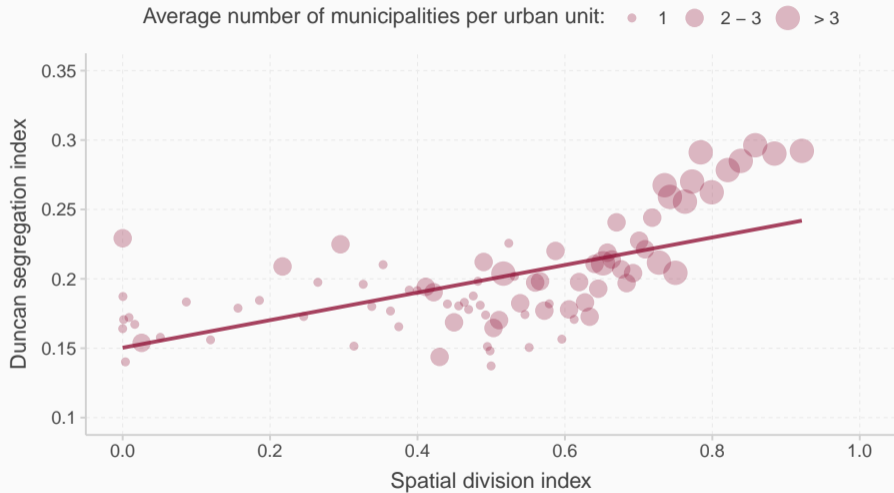
- *More subdivisions*
- *More unequal distribution of area across subdivisions*

**Control for the length of each
geographic feature in the urban unit**

Instrument spatial distribution [back](#)



First stage relationship [back](#)



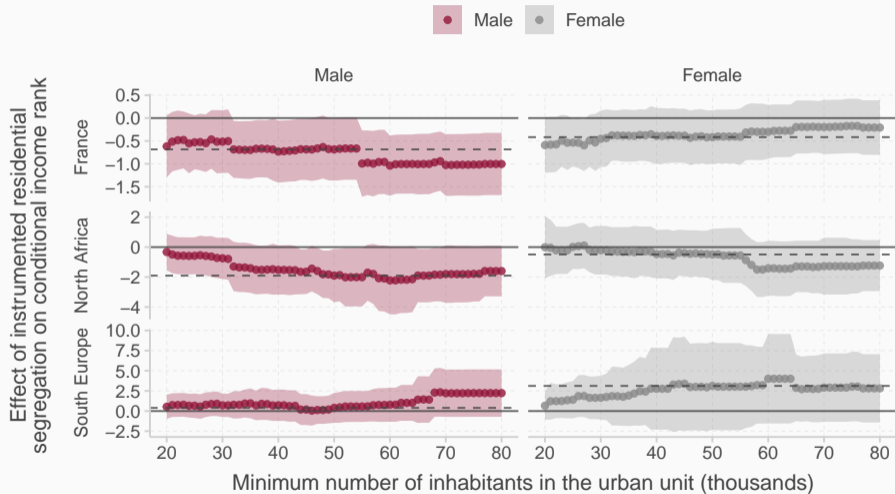
Second stage - naive regression (males) [back](#)

	Small urban units			Large urban units		
	France	North Afr.	South Eu.	France	North Afr.	South Eu.
%Immigrants	-0.17 (0.119)	-0.18 (0.421)	-0.73 (0.649)	0.14 (0.135)	0.04 (0.318)	-0.31 (0.670)
Segregation	0.10 (0.410)	-0.86 (2.738)	-0.38 (3.230)	-0.52 (0.649)	0.03 (2.800)	-6.02 (4.748)
%Imm. \times Seg.	0.01 (0.043)	0.07 (0.137)	0.17 (0.208)	-0.12** (0.047)	-0.06 (0.112)	0.07 (0.246)
Parents' rank	0.27*** (0.011)	0.26*** (0.071)	0.26*** (0.095)	0.26*** (0.008)	0.23*** (0.034)	0.18*** (0.052)
Constant	44.26*** (1.262)	41.09*** (8.136)	55.13*** (9.817)	45.59*** (2.256)	42.57*** (8.461)	72.02*** (13.739)
Observations	8,529	476	271	15,120	1,750	708
R ²	0.067	0.029	0.038	0.071	0.033	0.027

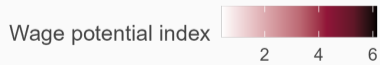
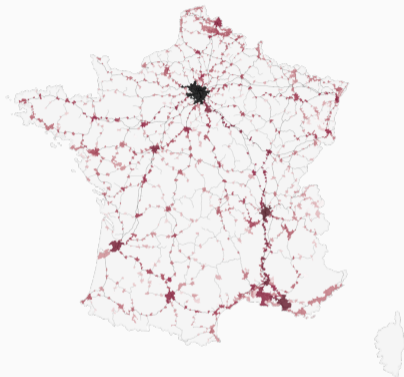
Second stage - naive regression (females) [back](#)

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Parents' rank	0.27*** (0.011)	0.26*** (0.071)	0.26*** (0.095)	0.26*** (0.008)	0.23*** (0.034)	0.18*** (0.052)
Constant	44.26*** (1.262)	41.09*** (8.136)	55.13*** (9.817)	45.59*** (2.256)	42.57*** (8.461)	72.02*** (13.739)
Observations	8,529	476	271	15,120	1,750	708
R ²	0.067	0.029	0.038	0.071	0.033	0.027

Second stage relationship [back](#)



Wage potential [back](#)



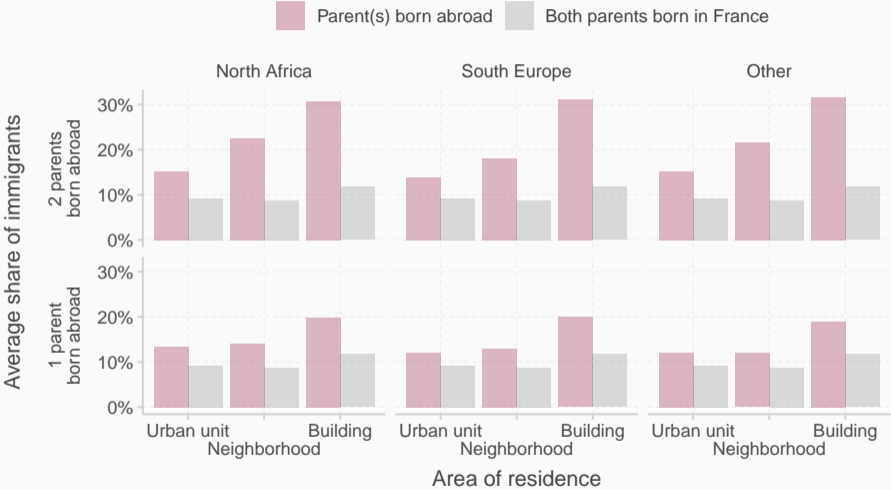
Second stage (male) [back](#)

	Small urban units			Large urban units		
	France	North Afr.	South Eu.	France	North Afr.	South Eu.
%Immigrants	-220.90 (7846.415)	6.43 (7.644)	7.73 (9.109)	2.12* (1.090)	5.14** (2.395)	1.52 (2.799)
$\widehat{\text{Segregation}}$	-2093.08 (74350.871)	27.64 (37.041)	98.13 (111.057)	5.23 (4.004)	36.48* (20.666)	-8.19 (15.371)
%Imm. \times Seg.	69.83 (2482.162)	-2.06 (2.468)	-2.89 (3.285)	-0.86** (0.395)	-1.92** (0.860)	-0.65 (1.067)
Parents' rank	-1.14 (49.777)	0.15 (0.151)	0.15 (0.310)	0.25*** (0.011)	0.23*** (0.060)	0.15*** (0.058)
Constant	5101.03 (179583.275)	-41.40 (107.983)	-193.21 (277.914)	27.17* (13.929)	-64.95 (65.005)	63.93 (51.191)
Geo. vars	✓	✓	✓	✓	✓	✓
Wage potential	✓	✓	✓	✓	✓	✓
Observations	6,571	402	218	15,054	1,741	705
F-stat. Seg.	23.78	3.22	1.18	523.59	29.58	15.02
F-stat. Seg. \times Imm.	230.12	1.73	5.99	259.96	24.58	7.22

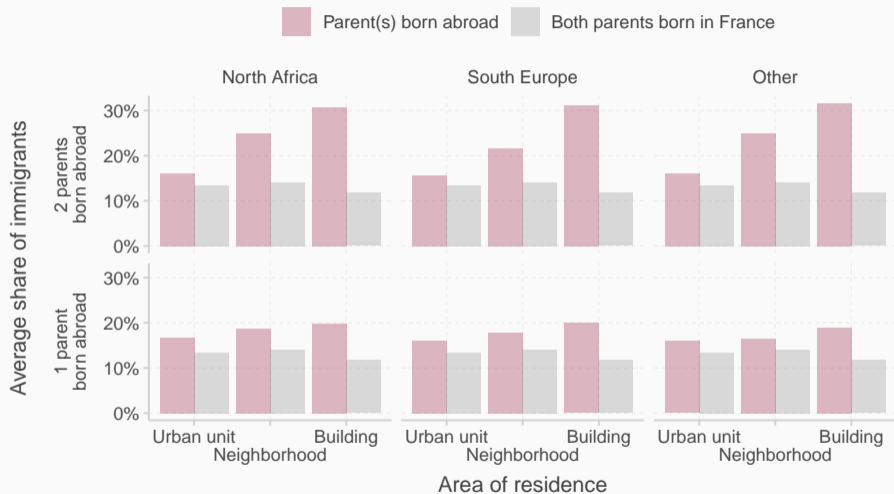
Second stage (female) [back](#)

	Small urban units			Large urban units		
	France	North Afr.	South Eu.	France	North Afr.	South Eu.
%Immigrants	11.88 (19.444)	-1.36 (2.610)	0.34 (3.498)	1.78* (0.970)	1.62 (2.657)	-8.30 (6.615)
$\widehat{\text{Segregation}}$	120.80 (222.680)	-8.20 (18.845)	20.05 (19.973)	6.71* (3.939)	11.19 (23.116)	-24.69 (29.477)
%Imm. \times Seg.	-3.70 (5.765)	0.43 (0.888)	-0.28 (1.143)	-0.69** (0.344)	-0.66 (0.953)	3.02 (2.467)
Parents' rank	0.37* (0.209)	0.13 (0.096)	0.34*** (0.107)	0.31*** (0.010)	0.22*** (0.052)	0.07 (0.073)
Constant	-266.41 (540.100)	51.47 (48.864)	-10.26 (52.660)	1.80 (13.835)	2.31 (73.217)	105.13 (81.542)
Geo. vars length	✓	✓	✓	✓	✓	✓
Wage potential	✓	✓	✓	✓	✓	✓
Observations	6,492	357	204	14,832	1,694	602
F-stat. Seg.	23.78	3.22	1.18	523.59	29.58	15.02
F-stat. Seg. \times Imm.	230.12	1.73	5.99	259.96	24.58	7.22

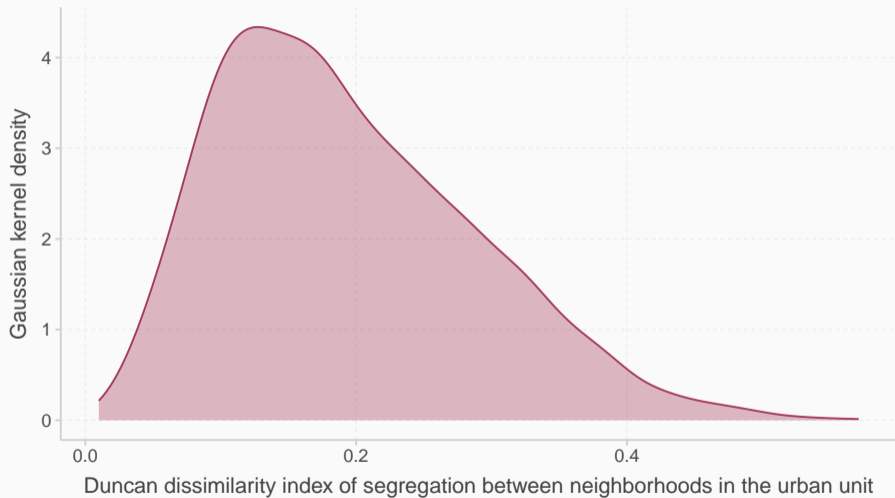
Share of immigrants in area of residence



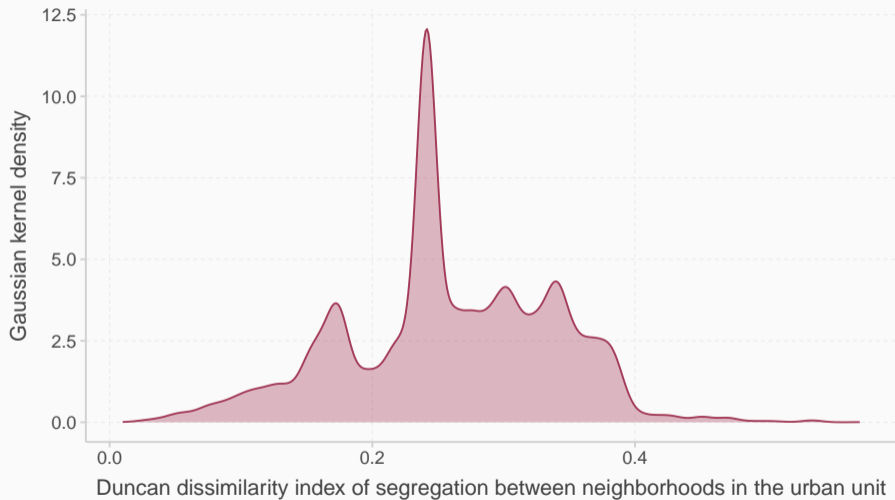
Share of immigrants in area of residence (constant)



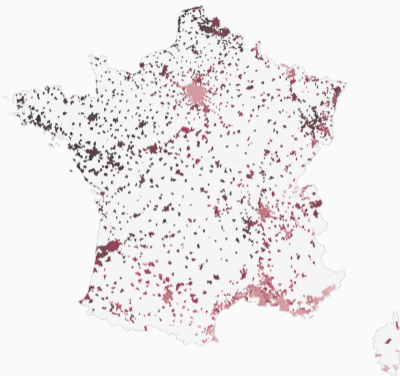
Density of residential segregation index



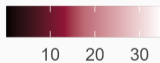
Density of residential segregation index (pop. weighted)



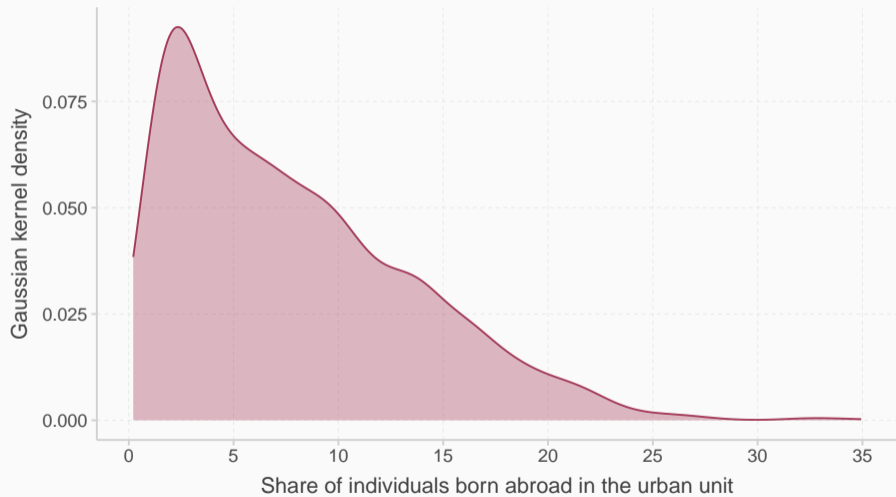
Share of immigrants



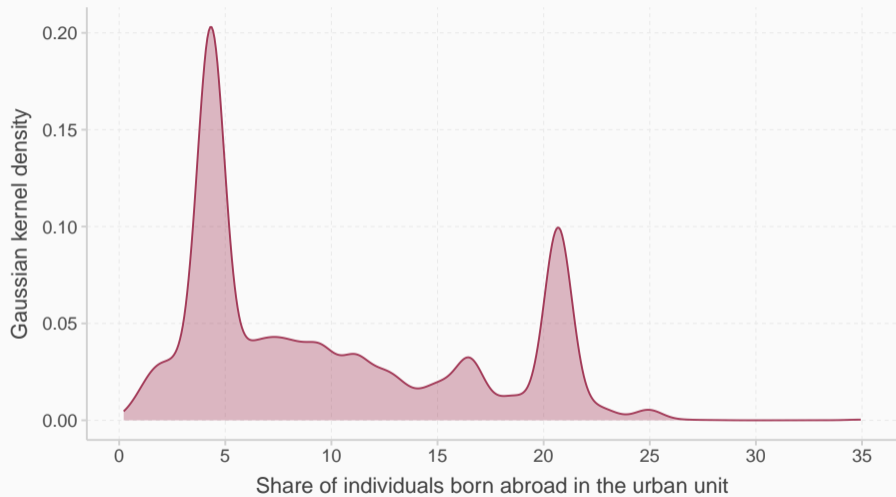
Share of individuals
born abroad (1990)



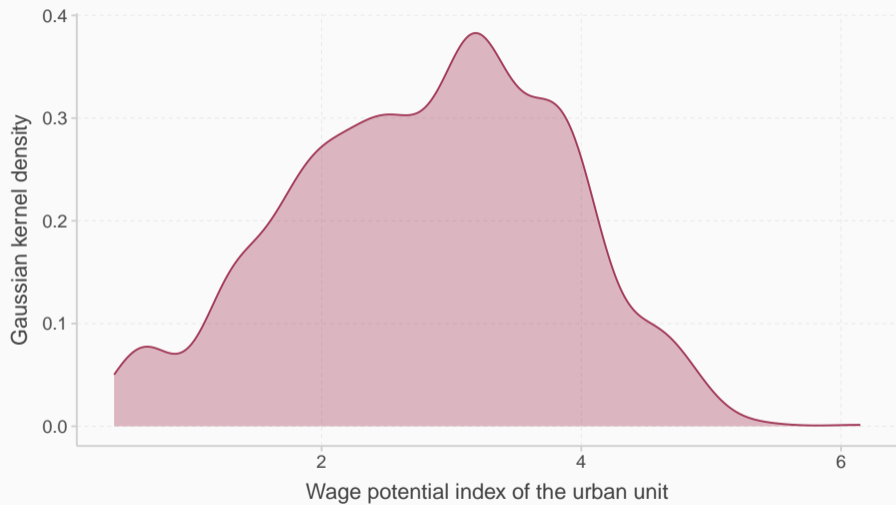
Density of share of immigrants



Density of share of immigrants (pop. weighted)



Density of wage potential



Density of wage potential (pop. weighted)

