





# Contextual effects at multiple spatial scales for the full population of the Netherlands

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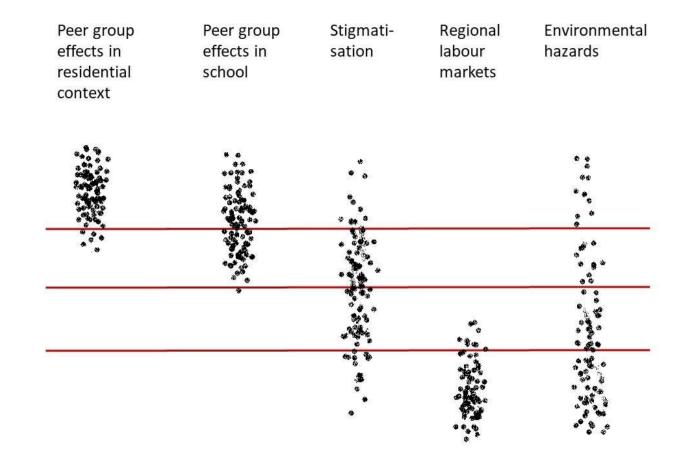


them-next-door-vetting-your-tenantsfuture-neighbours/#





https://www.lovemon ey.com/galleries/8164 6/rich-city-poor-citywhere-prosperity-andpoverty-areneighbours?page=31

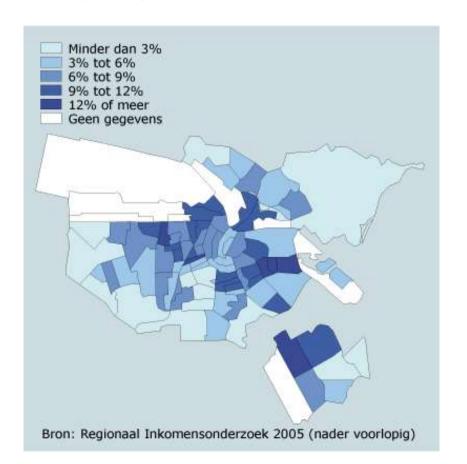




Urban region

Immediate surrounding of home

#### Share of low-income people in Amsterdam neighbourhoods





#### Aim of our research

To better understand the effect of spatial inequality on individual socioeconomic status

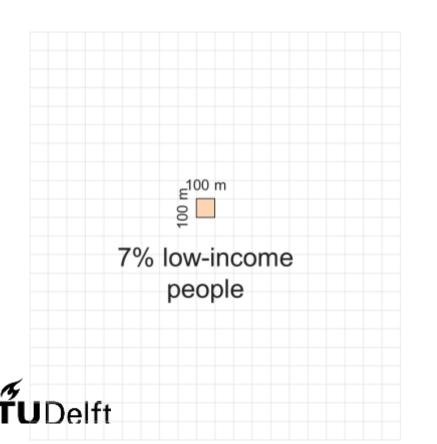
 To operationalise residential context at multiple spatial scales (from 100m by 100m grid cells up to areas with 10km radius)

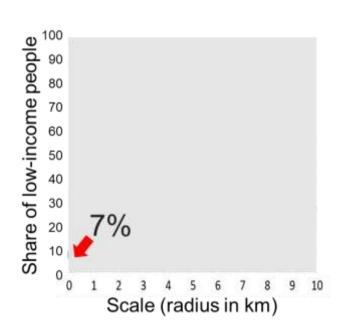




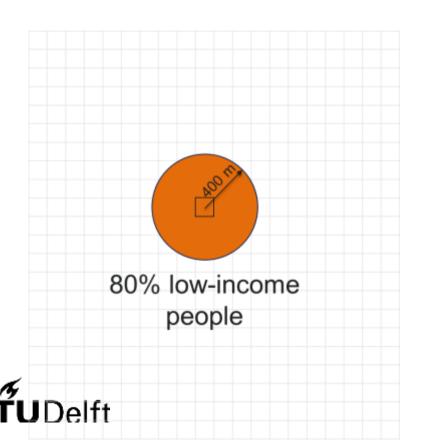
 To follow people over multiple years and model the effect of residential context on individual income

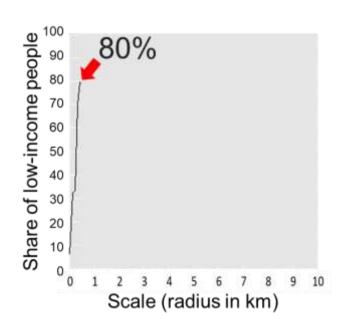




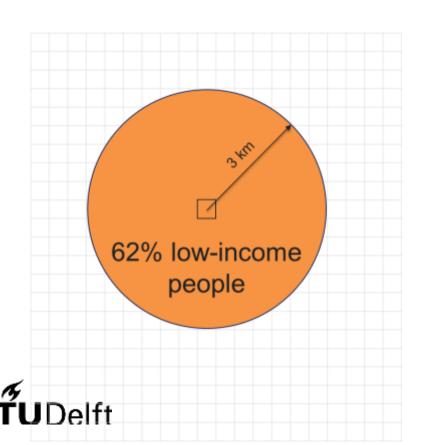


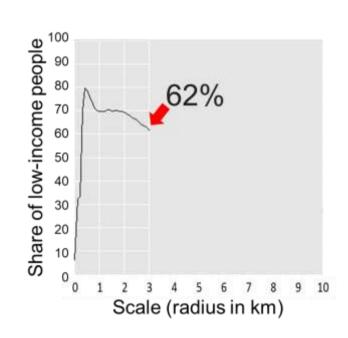




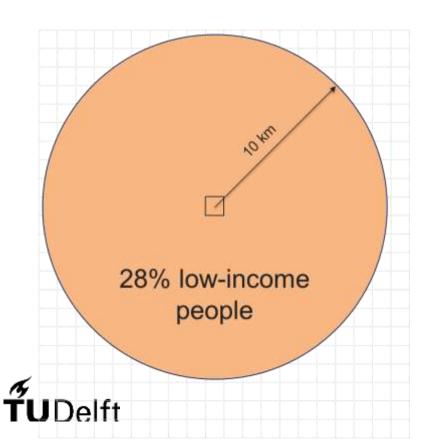


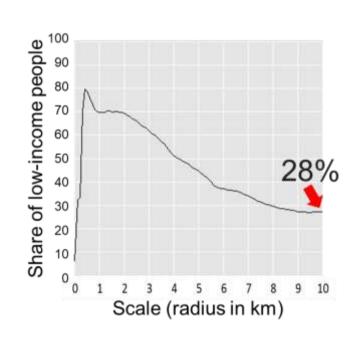


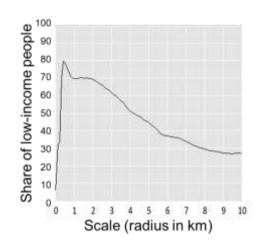


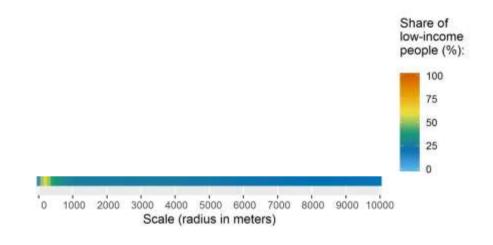




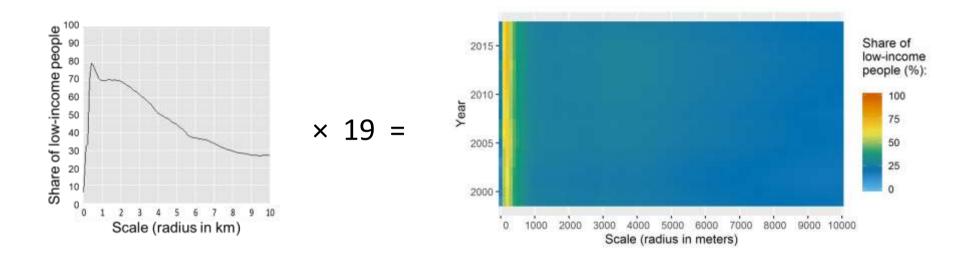




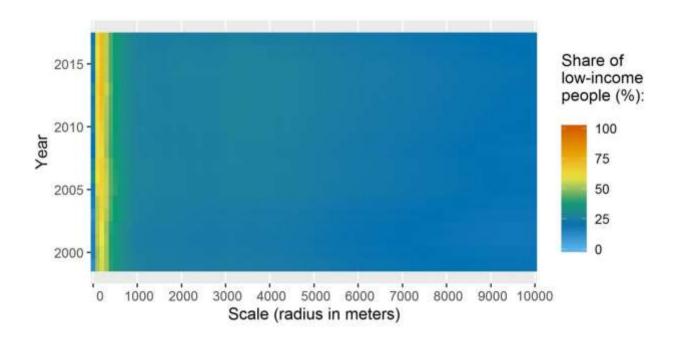




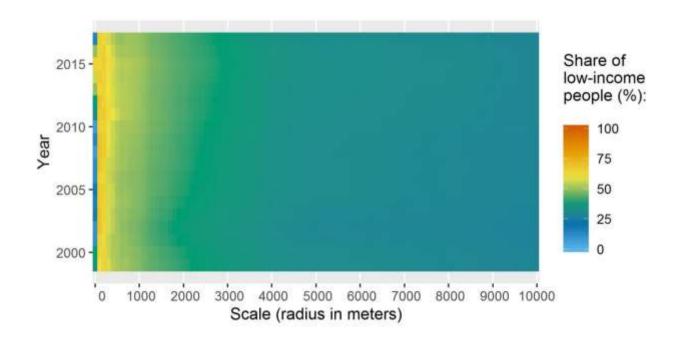




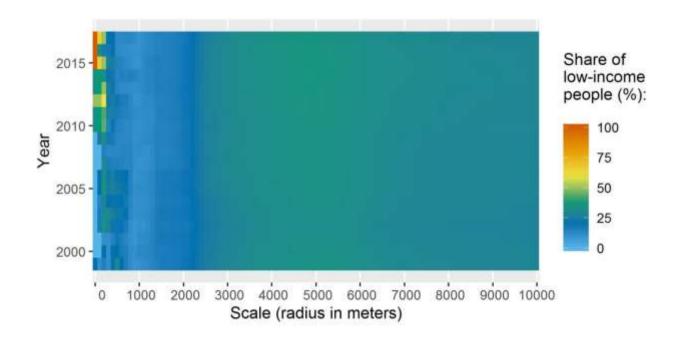




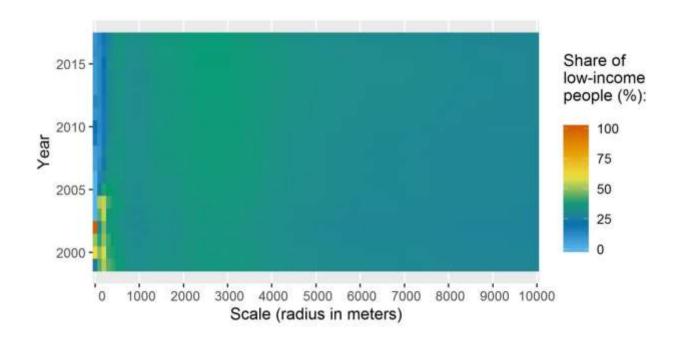














### **Billions of data points**

585,000 populated cells

- × 101 scales × 2 variables
- × 15 years = 1.8 billion

data points

→ 4 months continuous calculations



### Reduced computing time on ODISSEI Secure Supercomputer

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× 101 scales × 2 variables

× 15 years = 1.8 billion data points

→ 4 months continuous calculations

585,000 populated cells

× 101 scales × 3 variables

× 19 years = 3.4 billion data points

 $\rightarrow$  1 week on 24 nodes



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Parallel Stata jobs

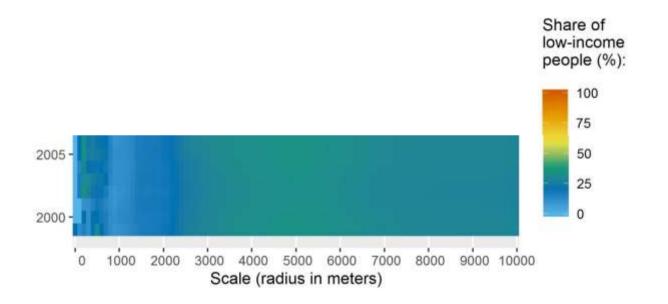


#### Back to understanding contextual effects

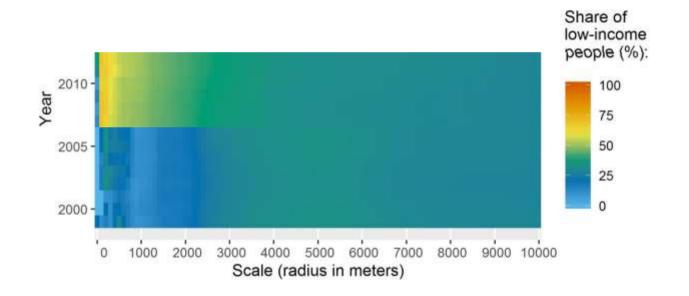
- Interest in individual outcomes over time
- Spatial context characteristics
  - Multiple scales
  - Multiple years

- Next step: Individual life course
  - People move between neighbourhoods
  - Neighbourhoods change over time

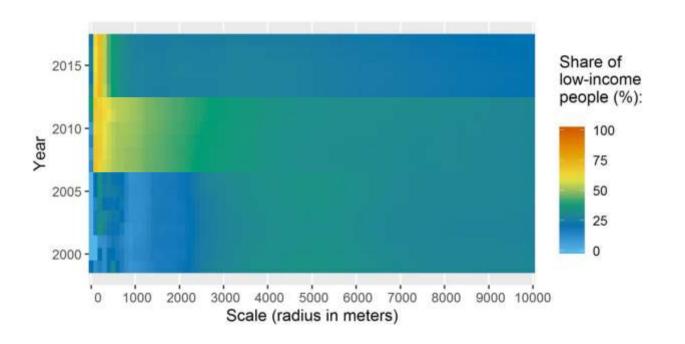






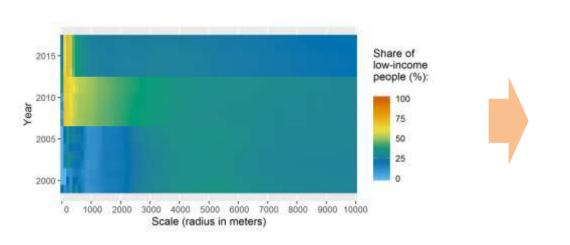


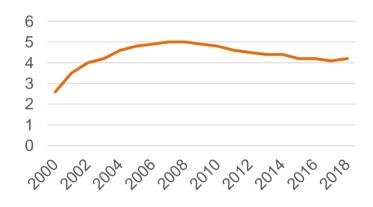






#### Individual income in 19 years













### Thank you!

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Recent publications:

Petrović, A., Manley, D., & van Ham, M. (2019). Freedom from the Tyranny of Neighbourhood: Rethinking Socio-Spatial Context Effects. *Progress in Human Geography*, Published online 28 August 2019 (open access).

Petrović, A., van Ham, M., & Manley, D. (2018). Multiscale Measures of Population: Within- and between-City Variation in Exposure to the Sociospatial Context. *Annals of the American Association of Geographers*, *108*(4), 1057-1074 (open access).







The research leading to these results has received funding from the European Research Council under the European Union's Seventh Framework Programme (FP/2007-2013) / ERC Grant Agreement n. 615159 (ERC Consolidator Grant DEPRIVEDHOODS, Socio-spatial inequality, deprived neighbourhoods, and neighbourhood effects) and from the Marie Curie programme under the European Union's Seventh Framework Programme (FP/2007-2013) / Career Integration Grant n. PCIG10-GA-2011-303728 (CIG Grant NBHCHOICE, Neighbourhood choice, neighbourhood sorting, and neighbourhood effects).



