Toxic Metal Injustice? Socioeconomic Status at Birth and Proximity to Airborne Contamination

 ${\sf Linuz} \; {\sf Aggeborn}^1 \quad {\sf Oscar} \; {\sf Erixson}^2 \quad {\sf Jenny} \; {\sf Jans}^3 \quad {\sf Mattias} \; {\sf \"Ohman}^2$

¹Department of Government, Uppsala University

²Institute for Housing and Urban Research (IBF), Uppsala University

³Swedish Institute For Social Research (SOFI), Stockholm University

November 9, 2022

Research question

- We study sorting in space due to airborne pollution
- We focus on three toxic metals: Arsenic, mercury, and lead
- We investigate whether SES groups are affected in different ways
- Intense political discussion regarding environmental injustice

Why should we care?

- Findings indicate that individuals of low SES live in closer proximity to contamination (Banzhaf et al., 2019b,a)
- On the other hand: Currie et al. (2020) show that the association between air pollution and SES (in the US) is not as robust anymore
- Earlier studies from Sweden have shown that lead negatively affects human capital development (Grönqvist et al., 2020)
- In this paper we take a broader descriptive perspective

Background and theoretical framework

- Environmental pollution is one of the big threats to public health (WHO 2022)
- Fetuses and infants are especially at risk (WHO 2005)
- Exposure has consequences for various outcomes later in life (e.g. Heckman 2007; Almond and Currie 2011)
- One chose where to live based on preferences and budget constraints
- This should result in non-random sorting in space
- Sorting reflect attributes of an area, such as labor market opportunities and local services (Tiebout 1956; Rosen 1979; Roback 1982)
- Sorting *may* apply in the case of apparent pollution, for example smog (Neidell 2009; Moretti and Neidell 2011; Zivin et al. 2011)
- It does not necessarily apply in the case of toxic metals, which are less visible

Data material

- Swedish registry data regarding place of residence on the grid level
- Income and demographic data from SCB
- Combined with data on arsenic, mercury, and lead pollution in the air from moss samples (data from IVL)
- To avoid airborne levels one must move in space
- There are recommendations regarding for example consumption of fish during pregnancy
- We map moss samples to grid of residence at the time of birth



Figure 1: Spatial Lorenz curves for family income and toxic metals.



(a) Ranked family income (b) Ranked family income (c) Ranked family income and arsenic and lead and mercury

Figure 2: Correlations between ranked levels of toxic metals (arsenic, lead, and mercury) and ranked levels of family income at birth.

The unit of analysis is the grid level, where the correlation is calculated for each year shown on the x-axis. The correlations are between each of the three toxic metals on the one hand, and ranked family income on the other. The y-axis displays correlation coefficients (r).



Figure 3: Number of moves

The figure displays the share of moves between parishes 9 months prior of conception and 9 months after conception (birth).



Figure 4: Event study: Sorting and salience.

Panels (a), (b), and (c) display coefficients from an event estimations including parish of birth fixed effects and year-month fixed effects. Standard errors are clustered at the parish of birth. We include a dummy for each event-month 9 months prior of conception and 9 months after conception (birth) where the month before conception is set as benchmark. The shaded areas are the 95% confidence intervals.

Conclusion

- The spatial distributions of airborne arsenic, lead, and mercury are not associated with the spatial distribution of SES at birth
- No evidence of sorting around pregnancy
- To sort geographically, in line with the model in Tiebout (1956), families need to have information on toxic metals
- Our results may serve as a stepping stone for future studies that estimate the causal effects of exposure towards toxic metals over the life-cycle

References

- Almond, D. and J. Currie (2011). Killing me softly: The fetal origins hypothesis. *Journal of Economic Perspectives 25*(3), 153–172.
- Banzhaf, S., L. Ma, and C. Timmins (2019a). Environmental justice: Establishing causal relationships. Annual Review of Resource Economics 11, 377–398.
- Banzhaf, S., L. Ma, and C. Timmins (2019b). Environmental justice: The economics of race, place, and pollution. *Journal of Economic Perspectives 33*(1), 185–208.
- Currie, J., J. Voorheis, and R. Walker (2020). What caused racial disparities in particulate exposure to fall? New evidence from the Clean Air Act and satellite-based measures of air quality. Working Paper 26659, National Bureau of Economic Research.
- Grönqvist, H., J. P. Nilsson, and P.-O. Robling (2020). Understanding how low levels of early lead exposure affect children's life-trajectories. *Journal of Political Economy* 128(9), 3376–3433.

- Heckman, J. (2007). The economics, technology, and neuroscience of human capability formation. *Proceedings of the National Academy of Sciences* 104(33), 13250–13255.
- Moretti, E. and M. Neidell (2011). Pollution, health, and avoidance behavior: Evidence from the ports of Los Angeles. *Journal of Human Resources* 46(1), 154–175.
- Neidell, M. (2009). Information, avoidance behavior, and health the effect of ozone on asthma hospitalizations. *Journal of Human Resources* 44(2), 450–478.
- Roback, J. (1982). Wages, rents, and the quality of life. *Journal of Political Economy 90*(6), 1257–1278.
- Rosen, S. (1979). Wage-based indexes of urban quality of life. InP. Mieszkowski and M. Straszheim (Eds.), *Current issues in urban economics*, pp. 74–104. Johns Hopkins Univ. Press.
- Tiebout, C. M. (1956). A pure theory of local expenditures. *Journal of Political Economy 64*(5), 416–424.

- WHO (2005). Effects of air pollution on children's health and development. Technical report, World Health Organization.
- WHO (2022). Compendium of who and other un guidance on health and environment, 2022 update. Technical report, World Health Organization.
- Zivin, J. G., M. Neidell, and W. Schlenker (2011). Water quality violations and avoidance behavior: Evidence from bottled water consumption. *American Economic Review 101*(3), 448–53.