

Impacts of Rainfall Shocks on Out-migration in Türkiye are Mediated More by Per Capita Income than by Agricultural Output

Nathan Delacrétaz, Bruno Lanz, Amir H. Delju, Étienne Piguet, Martine Rebetz

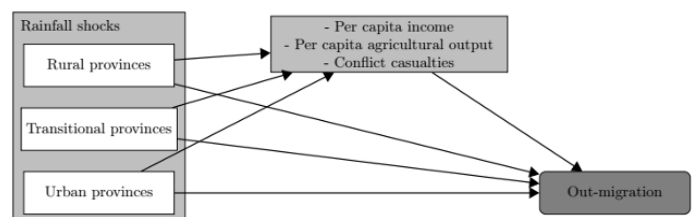
Will climate change induce large scale migration flows, and for what reasons? In this work, we quantify how rainfall shocks affect out-migration in Turkish provinces and study the role of urbanization and alternative drivers of migration decisions: per capita income, agricultural output, and local conflicts. Our results suggest that droughts induce a decrease in per capita GDP in rural provinces, which in turn acts as a push factor in out-migration decisions. One interpretation is that the economy of provinces with low level of urbanization are more exposed to climate variability, so that migration can represent an important adaptation margin for local populations.

Migration decisions are increasingly studied as an adaptation response to climate change and empirical evidence is important to quantify its relevance for policy decisions. Building on farm-level studies documenting the role of extreme weather events as a key detrimental determinant of agricultural yields (e.g., Schlenker and Roberts, 2009; Burke and Lobell, 2010), the objective of our work is to understand how random deviations from long-run precipitation patterns act as a push factor in migration decisions in societies with a predominantly rural population.

Our work contributes to research trying to identify the mechanisms linking climate shocks and migration, and we focus on three channels through which rainfall shocks affect out-migration. First, per capita GDP captures economy-wide impacts that ripple local economic activities, including (but not limited to) agriculture, and ultimately affect populations living in rural regions. Second, agricultural GDP per

capita may be directly affected by climate shock through agricultural yields, thereby acting as a push-factor, but it may also induce a poverty trap which prevents populations from migrating (Cattaneo and Peri, 2016). Lastly, we document how rainfall shocks affect local conflicts, which in turn may affect the extent of migration out of a given province. Figure 1 illustrates how we decompose the direct effect of rainfall shocks on out-migration across various channels.

Figure 1: Causality paths from rainfall shocks to out-migration



Note: Arrows illustrate causality paths between variables.

To document these effects, we exploit 2008-2018 provincial-level data for Türkiye, a middle-income country with a large share of predominantly rural regions. We characterize the extent to which yearly rainfall deviates from a long-run local distribution of precipitation by a standardized precipitation index (SPI), allowing us to control for differences in long-run distribution of rainfall across space. We further exploit the longitudinal dimension of the data to introduce fixed effects in the analysis and control for the fact that rural regions tend to experience higher out-migration on average and account for temporal trends in rural to urban migration.

Our results show that years subject to below-average SPI (drought) imply higher out-migration from rural areas. Quantitatively, a negative SPI shock of one standard deviation in the long-run distribution of rural provinces is associated with a 3 percent increase in yearly migration out of rural provinces. We then show that negative SPI shocks imply a reduction of economy-wide output in rural areas, which in turn acts as a push factor triggering out-migration. This corresponds to around 26% of the direct effect of SPI shocks on out-migration in rural provinces.

By contrast, we do not find significant evidence that per capita agricultural GDP is a channel at the average of the sample. In fact, our data suggest that the agricultural GDP is only a relevant channel for provinces that are in the upper quartile of crop production. Importantly, while the agricultural channel plays a role through crop production, it is only relevant for a small share of provinces that rely heavily on these crops, rather than for rural provinces in general.

Lastly, we show that the number of conflict fatalities in rural regions tends to increase with droughts, and that conflicts act as a push factor. In rural provinces, around 8% of the total effect of SPI shocks on out-migration can be attributed to conflicts. This suggests that a “conflict channel” operates

in parallel to the direct effect of SPI shocks on out-migration and hinges upon contextual and institutional factors (Abel et al., 2019).

One interpretation of our results is that provinces with low level of urbanization are more exposed to climate variability, making it more likely that precipitation shocks will act as a push factor in migration decisions. However, we emphasize that the mechanism that links droughts and migration in rural areas is more complex than a simple impact on the agricultural sector. One possible explanation is that price fluctuations for crops can impact other sectors of the local economy. In turn, for provinces with relatively high crop production and where the agricultural sector constitutes a larger share of the local economy, agricultural GDP is more directly affected by fluctuations in the SPI. Further research is needed to confirm this interpretation.

Furthermore, our analysis shows that conflicts also increase with droughts and play a role as a push factor in out-migration decisions, which is consistent with evidence from other contexts (Kelley et al., 2015; Missirian and Schlenker, 2017; Schutte et al., 2021; Eklund et al., 2022). This suggests that droughts give rise to separate channels through per capita GDP and conflicts. Taken together, more frequent droughts can be expected to increase out-migration in rural areas, both by affecting economy-wide activities and through conflicts. Making local economies more resilient to rainfall shocks, through local adaptation strategies or economic transfers, might help mitigate the impact of increased rainfall variability expected with future climate change.

We close by emphasizing that our data have not allowed us to document destination choices in relation to rural out-migration. Whether out-migration from rural provinces hasten urbanization, lead to rural-rural displacements, or induce international displacements, remains an open question.

References

Abel, G. J., M. Brottrager, J. C. Cuaresma, and R. Mutarak (2019) “Climate, conflict and forced migration,” *Global Environmental Change*, 54:239–249.

Burke, M. and D. Lobell (2010) “Food security and adaptation to climate change: What do we now?” *Climate change and food security*, pp. 133–153.



ceep.mit.edu

About the Center for Energy and Environmental Policy Research (CEEPR)

Since 1977, CEEPR has been a focal point for research on energy and environmental policy at MIT. CEEPR promotes rigorous, objective research for improved decision making in government and the private sector, and secures the relevance of its work through close cooperation with industry partners from around the globe. CEEPR is jointly sponsored at MIT by the MIT Energy Initiative (MITEI), the Department of Economics, and the Sloan School of Management.

Cattaneo, C. and G. Peri (2016) "The migration response to increasing temperatures," *Journal of Development Economics*, 122:127–146.

Delacrétaz, N., B. Lanz, A. H. Delju, É. Piguet, M. Rebetez (2023). "Impacts of Rainfall Shocks on Out-migration in Türkiye are Mediated More by Per Capita Income than by Agricultural Output." [MIT CEEPR Working Paper 2023-08](#), March 2023.

Eklund, L., O. M. Theisen, M. Baumann, A. Forø Tollefsen, T. Kuemmerle and J. Østergaard Nielsen (2022) "Societal drought vulnerability and the Syrian climate-conflict nexus are better explained by agriculture than meteorology," *Communications Earth & Environment*, 3, 85.

Kelley, C. P., S. Mohtadi, M. A. Cane, R. Seager, and Y. Kushnir (2015) "Climate change in the Fertile Crescent and implications of the recent Syrian drought," *Proceedings of the National Academy of Sciences*, 112 (11):3241–3246.

Missirian, A. and W. Schlenker (2017) "Asylum applications respond to temperature fluctuations," *Science*, 358 (6370):1610–1614

Schlenker, W. and M. J. Roberts (2009) "Nonlinear temperature effects indicate severe damages to U.S. crop yields under climate change," *Proceedings of the National Academy of Sciences*, 106 (37):15594–15598

Schutte, S., J. Vestby, J. Carling and H. Buhaug (2021) "Climatic conditions are weak predictors of asylum migration," *Nature Communications*, 12, 2067.

About the Authors



Nathan Delacrétaz is a Ph.D. candidate in economics at University of Neuchatel, Switzerland. His research focuses on climate and development economics and is supported by SNFS - the Swiss National Science Foundation.



Bruno Lanz holds the chair of Applied Economics at the University of Neuchâtel, Switzerland, and is a research associate with MIT's Center for Energy and Environmental Policy Research (CEEPR) and with the Joint Program on the Science and Policy of Global Change. In his research, Bruno uses a range of empirical methods including lab and field experiments, causal inference for observational data, and structural economic models to inform concrete problems of resource management. His recent publications focus on the costs/benefits of energy and climate policy, on the behavioral impact of carbon taxation, and on the credence nature of energy efficiency investments. He holds an M.Sc. in economics from HEC Lausanne, a MSc in Environmental and Resource Economics from University College London, and a Ph.D. in economics from ETH Zürich.



Amir H. Delju is a Senior Scientific Officer in the Climate Services Branch of the World Meteorological Organization (WMO), where he coordinates WMO's contribution to the United Nations Framework on Climate Change (UNFCCC) process and implementation of the Paris Agreement, mainly on adaptation-related activities. Amir has produced several publications for WMO on climate data and tools for adaptation in addition to a number of peer-reviewed papers on climatic and atmospheric patterns over the middle east region. He holds a Master of Science in Physical Geography (1999), Tehran, Iran.



ceep.mit.edu

About the Center for Energy and Environmental Policy Research (CEEPR)

Since 1977, CEEPR has been a focal point for research on energy and environmental policy at MIT. CEEPR promotes rigorous, objective research for improved decision making in government and the private sector, and secures the relevance of its work through close cooperation with industry partners from around the globe. CEEPR is jointly sponsored at MIT by the MIT Energy Initiative (MITEI), the Department of Economics, and the Sloan School of Management.



Étienne Piguet (Ph.D. University of Lausanne, 1998) is Professor at the Institute of Geography of the University of Neuchâtel (Switzerland). He is vice-president of the Swiss federal commission for migration (CFM/EKM). Etienne is specialized in migration studies with a focus on the migration/climate change nexus. He has written extensively on issues of migration flows, refugees, labor market integration of migrants, discrimination, statelessness, etc. He was Review editor for the IPCC 5th assessment report and has published numerous books and papers on the topic in scientific journals including the Annals of the American Association of Geographers, Population Space and Place, Nature (Climate change), Population and Development Review, Journal of Refugee Studies, etc. His latest book addresses asylum issues in Europe (Asile et réfugiés - Repenser la protection, Presses Polytechniques Romandes). He is currently involved in research projects on climate change perception and tipping points related to population displacements mainly in Western Africa.



Martine Rebetz is full professor in applied climatology and senior scientist, joint professorship of the WSL Swiss Federal Research Institute and of the University of Neuchâtel in Switzerland. She leads the Master studies in Geography, climate change and societies at the University of Neuchâtel. Her main research interests are climate change, observed climate change in Switzerland, in mountain regions and in Europe, impacts of temperature increase on snow packs and snow precipitation, impacts of climate change on societies in general, more specifically on agriculture, viticulture and forests as well as on mountain tourism.



ceep.mit.edu

About the Center for Energy and Environmental Policy Research (CEEPR)

Since 1977, CEEPR has been a focal point for research on energy and environmental policy at MIT. CEEPR promotes rigorous, objective research for improved decision making in government and the private sector, and secures the relevance of its work through close cooperation with industry partners from around the globe. CEEPR is jointly sponsored at MIT by the MIT Energy Initiative (MITEI), the Department of Economics, and the Sloan School of Management.