

Initiated by Deutsche Post Foundation

DISCUSSION PAPER SERIES

IZA DP No. 14566

Multigenerational Mobility in India

Anustup Kundu Kunal Sen

JULY 2021



Initiated by Deutsche Post Foundation

<section-header><text><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header><section-header>

JULY 2021

Any opinions expressed in this paper are those of the author(s) and not those of IZA. Research published in this series may include views on policy, but IZA takes no institutional policy positions. The IZA research network is committed to the IZA Guiding Principles of Research Integrity.

The IZA Institute of Labor Economics is an independent economic research institute that conducts research in labor economics and offers evidence-based policy advice on labor market issues. Supported by the Deutsche Post Foundation, IZA runs the world's largest network of economists, whose research aims to provide answers to the global labor market challenges of our time. Our key objective is to build bridges between academic research, policymakers and society.

IZA Discussion Papers often represent preliminary work and are circulated to encourage discussion. Citation of such a paper should account for its provisional character. A revised version may be available directly from the author.

ISSN: 2365-9793

IZA – Institute of Labor Economics

Schaumburg-Lippe-Straße 5–9	Phone: +49-228-3894-0	
53113 Bonn, Germany	Email: publications@iza.org	www.iza.org

ABSTRACT

Multigenerational Mobility in India*

Most studies of intergenerational mobility focus on adjacent generations, and there is limited knowledge about multigenerational mobility that is, status transmission across three generations. We examine multigenerational educational and occupational mobility in India, using a nationally representative data-set the India Human Development Survey which contains information about education and occupation for three generations. We find that mobility has increased over generations for education, but not for occupation. We also find that there are stark differences across social groups, with individuals belonging to socially disadvantaged communities in India lagging behind in social progress. Multigenerational mobility for Muslims in education and occupation have decreased in comparison to Hindus over the three generations. While we find that there is an increase in educational mobility for other disadvantaged groups such as Scheduled Castes, Scheduled Tribes, and Other Backward Classes compared to General Castes, we do not find evidence of increased occupational mobility over the three generations.

JEL Classification:	J62, J15, O12
Keywords:	multigenerational mobility, occupational mobility, educational
	mobility, India

Corresponding author:

Kunal Sen UNU-WIDER Katajanokanlaituri 6 B 00160 Helsinki Finland E-mail: sen@wider.unu.edu

^{*} This study is reproduced here with full acknowledgement of UNU-WIDER, Helsinki. The study was originally published under the UNU-WIDER project — Social mobility in the Global South - concepts, measures, and determinants.

1 Introduction

A large literature has examined the transmission of economic and social outcomes such as earnings, education, and occupation across generations (Erikson et al., 1992; Black and Devereux, 2010; Blanden, 2013; Corak et al., 2014; Chetty et al., 2014). While much of the literature has focused on developed countries, an emerging literature has studied whether there is intergenerational mobility in earnings, education, and occupations for developing countries (see Iversen et al., 2019 for a review). So far, the literature has focused on the association in socioeconomic status between adjacent generations (Solon, 1999, 2004). There has been relatively little research on multigenerational mobility, especially in the developing-country context (Solon, 2018). Yet the study of multigenerational mobility enables us to understand to what extent inequality of opportunity has declined in a country over time. In societies where there is dynastic transmission of wealth and social standing, intergenerational persistence of economic and social status is likely to occur, inhibiting social progress. In this paper, we examine the association in educational and occupational status across three generations of males in India.

A key limitation for the study of multigenerational mobility is a lack of good data than can span three generations (Güell et al., 2018). In the case of India, we take advantage of a nationally representative data set—the India Human Development Survey (IHDS) 2011– 12—which asks heads of households about their father's main occupation and educational level; we can also take advantage of the fact that many households in India are multigenerational. We focus on educational and occupational mobility instead of income mobility for two reasons. First, the survey questionnaire for the IHDS asks the head of the household about their father's educational level and occupational status, not about their income. Second, in the context of developing countries, the measurement of income is problematic, given the difficulty of obtaining reliable income estimates in economies with large agrarian and informal sectors (Iversen et al., 2019).

An important issue that comes up in the study of social mobility in developing countries is the existence of significant differences in the intergenerational correlation of education and occupation between social groups, where race, caste, and ethnicity may have a larger role to play in explaining the associations between the social and economic statuses of parents and their children compared to developed countries (Funjika et al., 2020). In the Indian case, several studies have shown that intergenerational mobility is weaker for individuals from disadvantaged groups such as backward castes and tribes (Scheduled Castes and Scheduled Tribes and Other Backward Classes (SC, ST, and OBC, respectively)), from religious minorities, and for individuals based in rural areas (Gang et al., 2011; Hnatkovska et al., 2012, 2013; Mohammed, 2019; Krishna, 2014).¹ We examine whether the intergenerational persistence in education and occupation has become weaker for children from SC, ST, OBC, and Muslim backgrounds compared to their parents (relative to grandparents).²

¹The caste system – a system of elaborately stratified social hierarchy – distinguishes India from most other societies (Beteille, 1992). Among the most distinctive factors of the caste system is the close link between castes and occupations, with Scheduled Castes clustered in occupations that were the least well paid and most degrading in terms of manual labour. The Scheduled Castes and Scheduled Tribes have the highest incidence of poverty in India, with poverty rates that are much higher than the rest of the population (Gang et al., 2008). The Other Backward Classes are higher in the caste/class hierarchy than the Scheduled Castes and Scheduled Tribes but are lower in the hierarchy than the Forward Castes.

²SC, ST, and Muslims comprise 16.2, 8.2, and 14.2 per cent of the population, respectively, according to the

We also examine whether being in a rural or urban area makes a difference in weakening intergenerational persistence in educational and occupational status over time. To do this, we use an innovative double difference (DD) method that exploits the fact that our data spans three generations. This allows us to assess whether mobility increased for sons from SC/ST, OBC, Muslims, and urban residents in comparison with their reference groups—General Castes, Hindus, and rural residents—and relative to their fathers.³

Our data set contains over 25,000 grandfather–father–son triads. The youngest age of the fathers in our sample is 36 and the oldest age is 99. The youngest age of the sons in our sample is 18 and the oldest age is 75. This implies that we are able to follow our three generations from around 1913 to 2012, a period that saw significant economic, political, and social change in India, including the onset of radical economic reforms in 1991, and the launch of major affirmative action programmes for the SC, ST, and OBC (Gang et al., 2017).⁴ Using this large time span of our data and estimates of intergenerational correlations in education and occupation for parent–son pairs relative to grandfather–father pairs, we are able to ask the following two questions: (1) has intergenerational persistence in education and occupation weakened over time in India? (2) If so, has it weakened more for SC, ST, OBC, Muslims, and rural residents than for General Castes, Hindus, and urban residents?

We find that there has been weakening of intergenerational persistence in education, but not for occupation for son–father pairs compared to father–grandfather pairs. We also find the clear presence of a 'grandfather' effect—the grandfather's status has an effect on the son's occupational and educational attainment, independent of the father's status. Further, we find that there are stark differences across social groups, with individuals belonging to socially disadvantaged communities in India lagging behind in social progress. Multigenerational mobility for Muslims in education and occupation have decreased in comparison to Hindus over the three generations. While we find that there is an upward mobility in education for other disadvantaged groups such as SC, ST, and OBC compared to General Castes, we do not find evidence of upward mobility in occupation over the three generations for these social groups relative to General Castes.

The rest of the paper is presented in six sections. In Section 2 we provide a brief review of the related literature. In Section 3 we discuss the data and how we construct grandfather–father and father–son pairs in occupation and education. In Section 4 we discuss the empirical strategy. In Section 5 we describe patterns of occupational and educational mobility using transition matrices. Section 6 presents the results and Section 7 concludes.

2 Related Literature

In this section, we selectively review the literature on educational and occupational mobility, with a focus on developing countries. On educational mobility, in a seminal study, Hertz et al. (2008) pool survey data for individuals aged 20–60 across 42 countries between 1994

²⁰¹¹ Census of India. The Indian Census does not collect data on the OBC social group, but estimates of their share of the Indian population is around 54 per cent (Bayly, 1999).

³General Castes are non-SC, non-ST, and non-OBC. They are mostly represented by forward castes, and are at the upper end of the Indian caste hierarchy (Bayly, 1999).

⁴The Constitution of India accords special preferential treatment not only to SC and ST, but also to other socially and educational disadvantaged castes, collectively known as OBC.

and 2004. They find strong persistence in educational status in Latin America and Africa, with the intergenerational regression coefficient (IGRC) being 0.79 in Latin America and 0.80 in Africa. In contrast, Nordic countries had high degrees of educational mobility, with an IGRC of 0.34. The study also finds a substantial increase in educational mobility across the world. Similarly, for Latin America, Ferreira et al. (2012) find a notable decline in the inequality of opportunities for educational attainment in the 2000s. A more recent study by Narayan et al. (2018) studies educational mobility for cohorts born between the 1940s and 1980s for a sample of 148 countries, and finds that absolute mobility is increasing for developing countries, but declining for developed countries, while relative mobility increases in both regions. In one of the most ambitious studies of social mobility in developing-country contexts, Alesina et al. (2021) use individual-level data from 68 censuses in 26 sub-Saharan African countries to find significant geographical variation in educational mobility. They find that a child who moves with her uneducated parents to a region with a one-standarddeviation higher intergenerational mobility than her birthplace at the age of six has a 7 percentage points higher likelihood of completing primary schooling, compared to her sibling who at the time of the move was already 11 years old. In the case of India, both Azam and Bhatt (2015) and Asher et al. (2020) find a decrease in educational persistence, as measured by the IGRC, over time. However, this decline can be explained by changes in the variance of education: rising variance of the father's education over time, with constant variance of the son's education.

With respect to occupational mobility, there are relatively few studies for developing countries, possibly due to the dearth of detailed data on the occupations of father-son pairs. An early study in this regard is that of Wu and Treiman (2007) for China. Zhao and Li (2017) study the effects of ethnicity and Hukou status on class mobility in China (see also Li, 2021). In a comparison of absolute mobility among social classes in four developing countries, Heath and Zhao (2021) find that Chilean men show the highest rate of social mobility (with the rate of intergenerational stability at 28 per cent), then Egypt, China, and, finally, India (which had a rate of immobility of 68 per cent). Bossuroy and Cogneau (2013) develop a Harris-Todaro-type farm-non farm sector model of intergenerational occupational mobility for five African countries. They observe higher relative mobility in Ghana and Uganda, more persistence in Cote d'Ivoire and Guinea and strong persistence in Madagascar. Azam and Bhatt (2015) analyse occupational mobility in India using the IHDS, finding progressive occupational mobility by birth cohort and that mobility among SC and ST born during 1965-84 exceeds mobility among higher castes. Using data from five successive cross-sections derived from the Indian National Sample Survey Organisation, Hnatkovska et al. (2013) find that the overall probability of an occupation switch has increased from 31 per cent in 1983 to 41 per cent in 2004–05, with the switch probability for SC and ST increasing from 33 per cent to 42 cent, while for others the increase is from 30 per cent to 39 per cent.

As noted in Section 1, the previous literature has focused on educational and occupational mobility across adjacent generations. In contrast, in this paper we examine mobility in education and occupation across three generations: grandfathers, fathers, and sons. We discuss next how we construct grandfather–father–son triads using the IHDS data for India.

3 Data

We use the IHDS, which is a collaborative project between the University of Maryland, the National Council of Applied Economic Research (NCAER), Indiana University, and the University of Michigan. The IHDS is a nationally representative survey of households across India with rounds in 2004–05 and 2011–12.⁵ In the first round 41,554 households were surveyed. In the second round 42,152 households were surveyed and 85 per cent of the households from the first round were resurveyed. The households lost to attrition in urban and rural blocks of northeastern states were physically verified by NCAER monitors and replacement households were randomly selected in the same neighbourhood to refresh the sample, which led to 2,134 new households being included in the second round (IHDS-2). We use IHDS-2, which has the advantage of being newer, providing updated data, and including information not only about co-residents, but it also about non-residents.⁶

3.1 Data construction

We focus on multigenerational mobility of male members of the household. More specifically, we look into the mobility estimates between household head's father, household head, and household head's resident and non-resident sons. We choose to focus only on the male members and not include the female members from the IHDS data for two reasons. First, women move to their husband's household after marriage in India, so the household-level information on adult women is almost exclusively on unmarried daughters.⁷ There is a selection-bias problem here that cannot be resolved. Note that the information on nonresidents in the household module does not include married daughters, who are taken to have left the household. Second, the question on the grandparent in the IHDS does not ask about the grandmother's education and occupation, only about the grandfather's. Figure 1 showcases the grandfather-father-son links that we investigate. The primary node represents the household head's father, or generation 1 (Gen 1). Gen 1 may have more than one son, the household head, and the household head's resident and non-resident siblings, represented by the secondary nodes generation 2 head (Gen 2 Head), generation 2 resident siblings (Gen 2 RS), and generation 2 non-resident siblings (Gen 2 NRS), respectively. The household head may have sons who are co-resident and/or who are non-residents. The tertiary nodes stemming from the household head represent the generation 3 resident sons (Gen 3 RS) and generation 3 non-resident sons (Gen 3 NRS).

The IHDS data provides detailed information on education and occupation of the male household and his resident sons. In addition, there is a separate module in the IHDS on household family members who have migrated, where information on the education and occupation of the non-resident family member, along with information on his relationship with the head of the household, is provided. This module allows us to obtain a nearcomplete specification of all grandfather–father–son triads (the only missing information would be for non-resident family members where education and occupation information is not available, and the information about the sons of Gen 2 NRS if they are not residing in the

⁵A third round, IHDS-3, is ongoing and is slated for release in 2023.

⁶We use IHDS-2 and not the panel as the non-resident information is missing in IHDS-1 which would lead to biased estimate due to co-resident sample selection as mentioned by Emran et al. (2018). Another reason to include IHDS-1 would be to check for survival bias. Asher et al. (2020) addresses the survivorship bias concern by showing their results to be consistent with IHDS-1.

⁷The IHDS has a women's module that identifies women between the ages of 15 and 49.

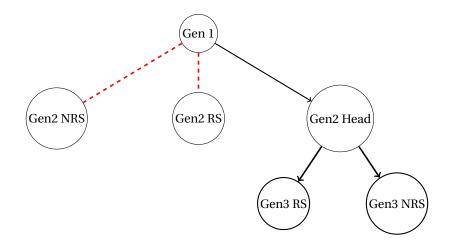


Figure 1: Generation tree

primary household).

Our data provides us with 21,031 observations of Gen 1–Gen 2 Head–Gen 3 RS triads and 4,310 observations of Gen 1–Gen 2 Head–Gen 3 NRS triads. Our data includes information about the resident household head as well as non-resident household heads or the household head's husband in the case of non-resident husbands of female heads. To identify the non-resident husbands with female heads, we use the non-resident family member roster.⁸ We used an age cut-off of 18 years for Gen 3 as by then most of the sons have completed their schooling.⁹ For Gen 2, we used an age cut-off of 36 years.

The primary module of IHDS-2 records the education and occupation of all the family members, including information on co-resident members and non-resident members. It records the household head's father's education and occupation even if the household head's father has died.¹⁰

3.2 Occupation

The IHDS survey asks about different sources of household income and each member's participation in each of those work activities and their level of participation. Occupation is categorized at the two-digit level, ranging from 1 to 99 following the Indian National Classification of Occupations (NCO), which in turn draws on the International Standard Classification of Occupations (ISCO) maintained by the International Labour Organisation (ISCO-88 and its antecedents).¹¹ The IHDS also contains created indicators for occupations such as salaried position, agriculture wage labour, non-agricultural wage labour, work in household

⁸As question 1.18 asks about the primary occupation of the household's father/husband's father (for most of his life), we could identify the education and occupation of the father-in-law in the case of a household with a female head whose husband is a non-resident.

⁹As a robustness test, we increased the age cut-off to 21 years and found that the results not change significantly, as shown in Table 2.

¹⁰To identify the household head's father (or Gen 1) and his education and occupation we used the relationship field in the household roster and matched the information with the household head's response to the father's education and occupation question. We identify the household head (Gen 2 Head) and the Gen 3 resident sons (Gen 3 RS) using the relationship field in the household roster. We use the information on nonresidents to identify and link the Gen 3 non-resident sons (Gen 3 NRS) with the household head.

¹¹Detailed in Appendix Table A7.

	Table 1: Occupational Categories and Codes
Category 6	Professional (Occupation codes 00-29)
Category 5	Clerical and other (Occupation codes 30-39, 40-49)
Category 4	Farmers (Occupation codes 60-62)
Category 3	Higher status vocational occupations (Occupation codes 43,
	49, 50-52, 56-59, 79, 84-87).
Category 2	Lower status vocational occupations (often caste based,
	traditional): 53-55, 68, 71-78, 80-83, 88-93, 96-98
Category 1	Agricultural and other manual labourers, including construc-
	tion workers (Occupation codes 63-67, 94, 95, 99)

business, family farm work, and animal care work based on whether an individual spent more than 240 hours on the particular work. In order to check if each individual's occupation is accurately categorized, we constructed variables for hours of work in salaried work, agriculture, and non-farm/business activities. We classified workers as salaried workers if they had spent more than or equal to 240 hours in wage or salary work in the past year. Farming and non-farming activity workers were classified in a similar way. We use the twodigit occupational codes given in the data for salaried workers to assign each salaried worker to their respective occupation. In the case of agricultural workers, we assign them as cultivators or farmers other than cultivators based on land owned, and we classified workers as animal care workers if they reported taking care of animals.

A limitation of the ISCO occupational schema, which were designed primarily for comparative purposes, is that it may miss some of the important institutional arrangements, anchored in history, that characterize individual developing countries (Heath and Zhao, 2021). A key feature of the ISCO occupational schema is the use of skill requirements as the main principle guiding occupational rank (e.g., Armstrong, 1972; Ganzeboom and Treiman, 1996). In the Indian context, the translation of skill requirements into occupational status is made more intricate by caste (Gang et al., 2017). Independently of the skill requirements of their traditional, caste-based occupations, SC individuals are, for example, likely to have low social status. To categorize occupation as a social status ladder, we follow Iversen et al. (2016) and categorize occupation into six discrete ordered categories, as shown in Table 1.¹²

The ordering of occupations in Table 1 follows the hierarchical scale proposed by Armstrong (1972), with Category 6 - Professionals - having the highest socio-economic status (SES) and Category 1 - Agricultural and other manual labourers - having the lowest SES.¹³ This hierachical scale has been commonly used by sociologists, and has been found to be strongly correlated with both "social standing" and with income (see Hodge et al. (1964) for the former and Williamson (1982) for the latter). In the Indian case, we also find that this is the case (see Appendix Figure A1).¹⁴

¹² Iversen et al. (2016) distinguish between vocational occupations that are skilled but low status because of a caste connotation and those that are not. Examples of low-status vocational occupations are blacksmiths and shoe-makers. Examples of high-status vocational occupations are machinery/electrical fitters and plumbers.

¹³Therefore, in our classification, a movement from Category 1 to any Category from 2 to 6 will be upward occupational mobility.

¹⁴One question that may arise with the ordering of occupations in Table 1 is whether farmers (Category 4) should be ranked higher than higher-status vocational occupations (Category 3), as several of them may be

3.3 Education

The primary module of the IHDS records the years of education of the father of the household head, the household head, and his resident sons. The non-resident family members section of the primary module helps us to link the non-resident household head's sons (Gen 3 NRS) with the household head. The IHDS contains information on the education of the household head's father even if he is not resident or has died. In the IHDS, years of education are recorded in multiple ways, allowing us to cross-check the validity of the responses. For example, the household head's father's (Gen 1) education may be obtained from (1) the household identification; (2) the household roster (if he is a co-resident), or the non-resident family members (if he is a non-resident); and (3) from the household head's wife's response to the husband's father's education question. The IHDS records completed years of education. We categorize years of education into seven categories.¹⁵ The categories are (1) illiterate with less than primary (<2 years); (2) literate with less than primary (2–4 years); (3) primary; (4) middle; (5) secondary; (6) higher secondary; and (7) post-secondary.¹⁶

4 Empirical Specification

To measure the extent of socioeconomic status transmission across generations, social scientists conventionally estimate β_{-g} in a linear regression model such as:

$$y_{i,t} = \alpha + \sum_{g=1}^{G} \beta_{-g} y_{i,t-g} + \varepsilon_{i,t}$$
(1)

where $y_{i,t}$ is the socioeconomic status such as education, income, occupation, or wealth of the son of family *i* at period *t*. $y_{i,t-g}$ is the socioeconomic status of the ancestral generation *g*. The coefficient β_{-g} captures persistence, and is the IGRC, and $1 - \beta_{-g}$ captures the social mobility (see Solon, 2004). Equations 2.1 and 2.2 estimate intergenerational mobility in occupation and education between G2–G1 and G3–G2 pairs. The coefficients of interest are β_{12} and β_{23} , which estimate the intergenerational persistence in occupation and education between G2–G1 and G3–G2 pairs respectively. That is, these coefficients are the IGRCs for son–father and father–grandfather mobility regressions, respectively.

$$Y_{i,g_{12}} = \beta_{02} + \beta_{12} Y_{i,g-1} + \varepsilon_{ig_{12}}$$
(2.1)

$$Y_{i,g_{23}} = \beta_{03} + \beta_{23} Y_{i,g-1} + \varepsilon_{ig_{23}}$$
(2.2)

Solon (2018) proposes a three-generation version of equations (2) and (3), where we regress the son's (Gen 3) occupation or education on each ancestral generation's occupation or education:

$$Y_{i,g} = \beta_0 + \beta_1 Y_{i,g-1} + \beta_2 Y_{i,g-2} + \varepsilon_{ig}$$
(3)

where $Y_{i,g}$ is the son's (Gen 3) occupation/education, $Y_{i,g-1}$ is the parent's (Gen 2 Head) occupation/ education, $Y_{i,g-2}$ is the grandparent's (Gen 1) occupation/education, and ε_{ig} refers to the error term. The coefficients β_1 and β_2 provide estimates of intergenerational persistence across son–father and son–grandfather pairs, and can be seen as IGRCs in a

small and marginal farmers. We experimented with an alternate ordering with farmers ranked below higherstatus vocational occupations with no change in our results.

¹⁵ These are standard categories used in many surveys in India, including the National Sample Surveys.

¹⁶ Similar educational categories have been used by Asher et al. (2020).

three-generational formulation of a Solon-type (2014) regression. Here, β_2 captures the 'grandfather' effect—if β_2 is positive and significant, it suggests that the grandfather's status has an effect on the grandson, independent of the effect of the father.¹⁷

Our dependent variables are ordered variables, with higher values implying higher occupational ranks or higher levels of educational attainment. The dependent variable for estimating occupational mobility goes from a value of 1 for agricultural and other labourers to a value of 6 for professionals. The dependent variable for estimating educational mobility goes from a value of 1 for years of education less than two years of schooling, to a value of 7 for higher education. We estimate linear probability models for equations (2.1), (2.2), (3), and (4).

We are also interested in assessing whether intergenerational mobility among certain groups in India has increased relative to the rest of the population over the three generations. We use a DD method analogous to the difference in difference (DID) method to exploit the multigenerational nature of our data and to test for differences in mobility across various groups in our sample over generations. We pool generation 1 and generation 2 to estimate

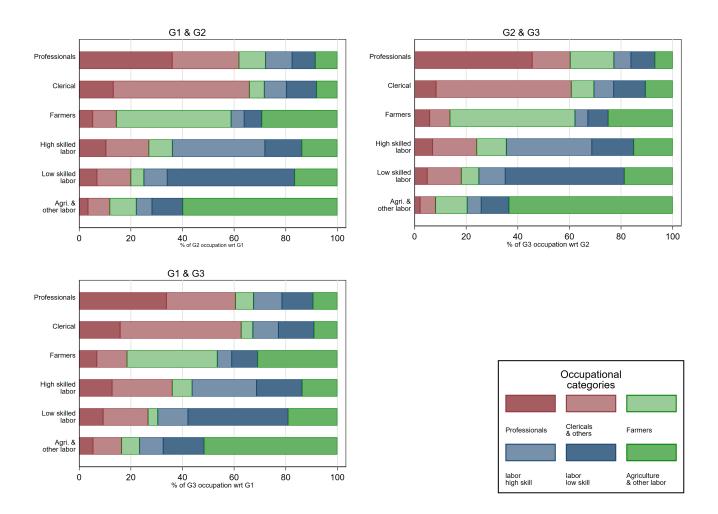
$$Y_{ij} = \alpha + \gamma S_{ij} + \lambda G_{ij} + \rho (S_{ij} * G_{ij})$$
⁽⁴⁾

where *i* is the son–father–grandfather triad and *j* is the generation/time, (j = 1 for generation 1, j = 2 for generation 2 and j = 3 for generation 3). Y_{ij} is the occupation/education of generation *j*. S_{ij} is the location dummy (equal to 1 for urban residents), social group dummy (SC/ST, OBC), or religion dummy (Muslim) (analogous to the 'treatment' group dummy in DID). G_{ij} is the generation/time dummy, which takes a value of 1 for generation 3 and 0 for generations 1 and 2 (analogous to the 'treatment' dummy in DID). $S_{ij} * G_{ij}$ is the interaction term, analogous to the 'treatment effect' in a DID model.

The coefficient α shows the average *Y* in the 'non-treated' group in the 'pre-treatment' period. γ shows the difference between the 'treatment' group and the 'control' group in the 'pre-treatment' period. λ captures the change in *Y* between the 'pre-treatment' and the 'treatment' period. ρ captures the change in *Y* in the 'treatment' group between the 'pre-treatment' and the 'treatment' period, relative to the change in *Y* in the 'control' group, and is the coefficient of interest. If the coefficient on the interaction term is positive and statistically significant, multigenerational mobility has increased for the 'treatment' group (urban, SC/ST, OBC, Muslim) relative to the 'control' group, and Hindus for the Muslim 'treatment' group). We cluster the standard errors at the household level.

¹⁷ As Solon (2018) notes, a key prediction of the Becker and Tomes (1979) model would be that the coefficient on the grandfather's status is negative, implying that all the advantages or disadvantages of ancestors would disappear in three generations.

5 Patterns of Occupational and Educational Mobility



5.1 Occupation

Figure 2: Occupational mobility across generations

For an initial look at patterns of occupational mobility, we construct a 6 × 6 transition matrix. Figure 3 shows occupational mobility between the three generations. The top-left panel of Figure 3 shows the occupational mobility between generation 1 (household head's father) and generation 2 head (household head), while the top-right panel of the figure shows occupational mobility between the generation 2 head and generation 3 son (household head's son), and the bottom-left panel shows the occupational mobility between generation 1 and generation 3. The vertical axis shows the occupation of the younger generation, conditional on the occupation of the older generation, depicted in the horizontal axis. If we look at the top-left panel of Figure 3 or Appendix Table A1, for father–grandfather pairs, we can see that 39.1 per cent of professionals' sons are in professional occupations, 54.9 per cent of clerical workers' sons are in clerical jobs, 46.3 per cent of farmers' sons are farmers, 37.3 per cent of high-skilled labourers' sons are high-skilled labourers, 48.8 per cent of low-skilled labourers' sons are agricultural labourers' sons are agricultural labourers. For son–father pairs, we find that 46.1 per cent of professionals' sons are in professional occupations, 54.9 sons are in clerical jobs, 39.4

per cent of farmers' sons are farmers, 32.9 per cent of high-skilled labourers sons are highskilled labourers, 45.1 per cent of low-skilled labourers' sons are low-skilled labourers, and 60 per cent of agricultural labourers' sons are agricultural labourers.

A striking finding from the transition matrix for the overall sample is the stickiness of occupations at both the upper and lower ends of the occupational status ranking. For example, at the upper end of the occupational distribution, 39 per cent of the sons of the G1 generation who are professionals remain professionals, and this increases to 46.1 per cent for the G3–G2 pair. At the lower end of the occupational distribution, 57.5 per cent of the sons of the G1 generation who were agricultural and other labourers remain in the same occupational status, and this increases to 60 per cent for the G3–G2 pair. Over time, there is some evidence of upward occupational mobility—for example, 7.1 per cent of the grandsons of the G1 generation who were agricultural and other labourers become professionals, compared to 4.1 per cent of the sons of the G2 generation. Similarly, 10.5 per cent of the grandsons of the G1 generation who were low-skilled workers become professionals as compared to 6.3 per cent of the sons of the G2 generation.

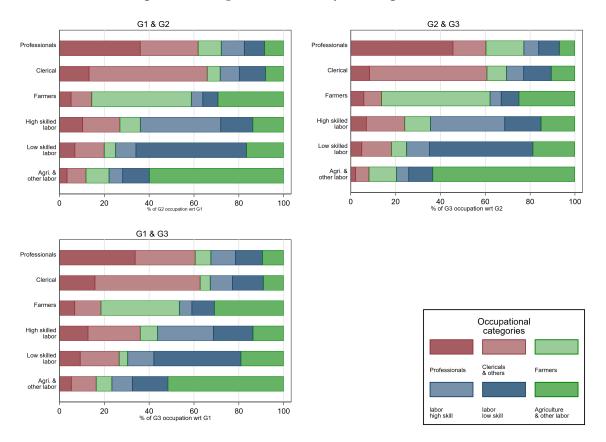


Figure 3: Occupational mobility across generations

Source: authors' compilation based on IHDS data.

In Appendix Figure A3 we present the distribution of occupational rankings across states in India for generations 1, 2, and 3. It is clear that there is large geographical variation in occupational status across India, with higher occupational status for generation 1 in western and eastern India, as compared to other regions. Over the three generations, one can see a significant increase in occupational status in northwest India, but also a decrease in occupational status in western India.

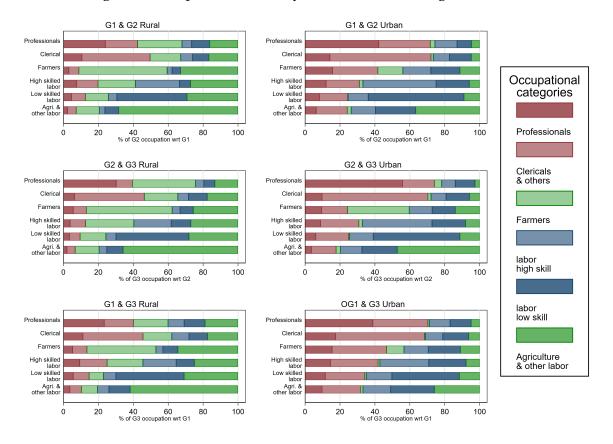


Figure 4: Occupational mobility across location over generations

Source: authors' compilation based on IHDS data.

Disaggregating the occupational mobility matrices by location and across religion and caste, we see significant upward mobility for the grandsons of the G1 generation who were at the lower end of the occupational status ranking (agricultural and other labourers and low-skilled workers) for the urban sample as compared to the rural sample (Figure 4). Across religion, we do not see any clear differences in upward mobility for Hindus versus Muslims and other religions (Figure 5). However, we see clear intergenerational persistence in occupational status at the lower end of the occupational ranking for OBCs and SC/STs compared to General Castes over time (Figure 6).

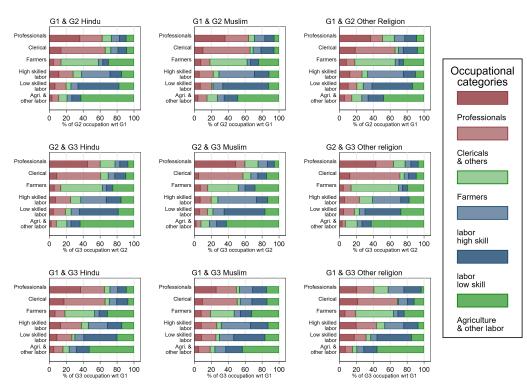
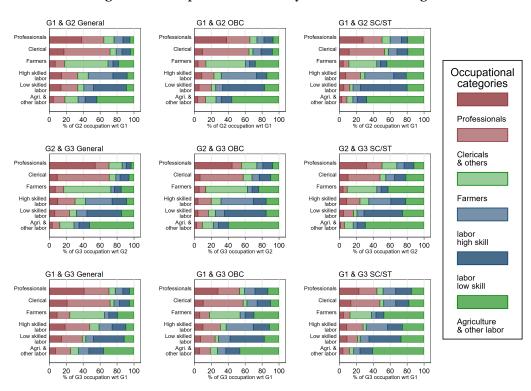


Figure 5: Occupational mobility across religion over generations

Figure 6: Occupational mobility across caste over generations



5.2 Education

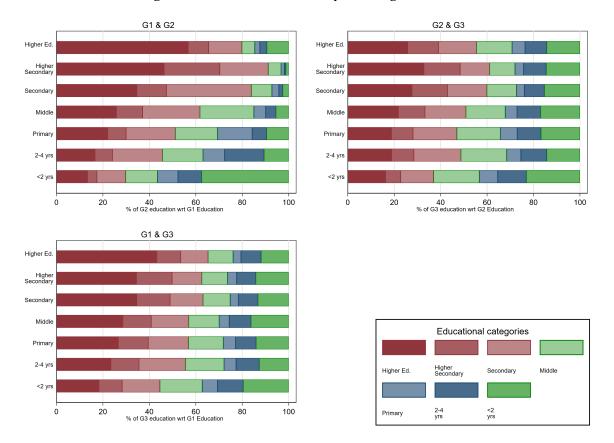


Figure 7: Educational mobility across generations

Source: authors' compilation based on IHDS data.

For an overview of the data and patterns in mobility, we categorize years of education into seven categories: (1) illiterate with less than primary; (2) literate with less than primary; (3) primary; (4) middle; (5) secondary; (6) higher secondary; and (7) post-secondary. We construct a 7×7 transition matrix. Figure 7 shows educational mobility between the three generations. The top-left panel of the figure depicts the educational mobility between generation 1 (household head's father) and generation 2 head (household head), while the top-right panel shows educational mobility between generation 2 head and generation 3 son (household head's son), and the bottom-left panel shows educational mobility between generation 1 and generation 3. The vertical axis in Figure 7 shows the educational attainment of the younger generation conditional on the educational attainment of the older generation, depicted in the horizontal axis. If we compare the top-left and top-right panels of Figure 7, we see that there has been a significant drop in educational attainment between generation 2 and generation 3 for the top three educational categories. This difference is even more prominent if we look at Appendix Tables A4 and A5. However, at the lower end of the educational attainment distribution, we see substantial progress in educational mobility-the proportion of male children who have pre-primary or no years of education similar to their fathers has reduced considerably as we move from the father-grandfather pair to the sonfather pair. While 43 per cent of the sons (generation 2) of the first generation who had no or pre-primary level of education also had no or pre-primary level of education, the corresponding number was 14.3 per cent for the G3–G2 pair. For the grandfathers who had no or pre-primary level of education, a remarkable 29 per cent of their grandsons had attained higher education.

In Appendix Figure A2 we present the distribution of educational levels across states in India for generations 1, 2, and 3. Educational levels vary considerable across India for the same generation. Over time, there is an increase in educational levels over the three generations in western and southern India.

We next look at patterns of educational mobility by location, and across religion and caste. We find that multigenerational mobility is more evident for urban residents than rural residents at the lower end of the educational attainment distribution (no or pre-primary level of education) and multigenerational persistence is more evident for the higher end of the educational attainment distribution (higher education or higher secondary levels of education) (Figure 8). We find that the intergenerational persistence in education levels at the lower level of the educational attainment distribution (no or pre-primary level of education) has reduced over time for Hindus and other religions (Christians and Sikhs), but less so in the case of Muslims (Figure 9). Finally, across caste, we do not find any observable differences in multigenerational mobility at the lower end of the educational attainment distribution (no or pre-primary level of educational mobility at the lower end of the educational attainment distribution (no or pre-primary level of).

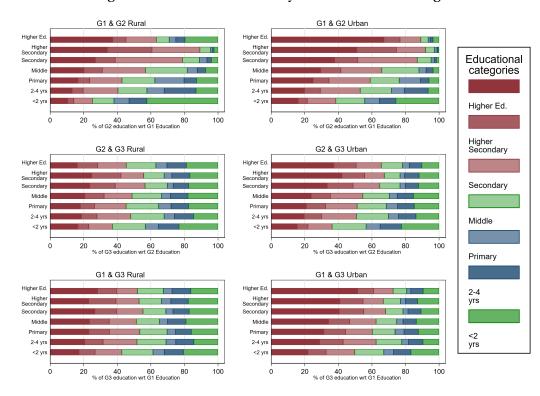


Figure 8: Educational mobility across location over generations

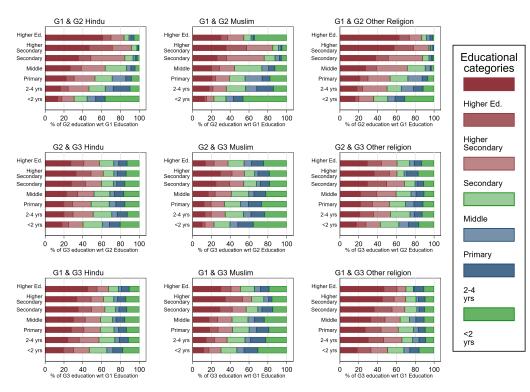
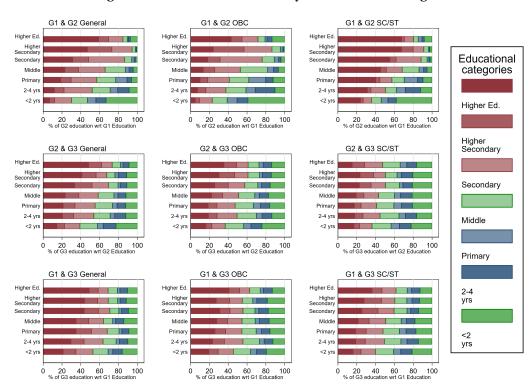


Figure 9: Educational mobility across religion over generations

Figure 10: Educational mobility across caste over generations



6 Results

Table 2 presents the estimation results using equations (2.1), (2.2), and (3). In columns 1 and 2 we estimate equations (2.1) and (2.2) for occupational mobility. In columns 3 and 4 we estimate equations (2.1) and (2.2) for educational mobility. We do not find evidence of increased occupational mobility over the three generations, with the IGRC for the son–father pair being higher than the IGRC for the father–grandfather pair. Specifically, the coefficient for occupational mobility for the father–grandfather pair is 0.423 (column 1), while the coefficient for occupational mobility for the son–father pair is 0.461 (column 2), both being statistically significant at the 1 per cent level. On the other hand, we find evidence of educational mobility across the three generations, with the IGRCs decreasing from the father–grandfather pair to the son–father pair. Specifically, the coefficient for educational mobility for the father–grandfather pair for educational mobility for the son–father pair is 0.587 (column 3), while the coefficient for educational mobility for the son–father pair is 0.356 (column 4), both being statistically significant at the 1 per cent level.

Estimating the three-generation version of the mobility regressions (equation (3)), we find clear evidence of a 'grandfather' effect in both occupational and educational mobility. The estimated coefficient on the grandfather's occupational status is 0.123 and is statistically significant at the 1 per cent level for occupational mobility (column 5). Similarly, the estimated coefficient on the grandfather's educational status is 0.0649 and is statistically significant at the 1 per cent level for educational mobility (column 7). If we increase the age cut-off from 18 to a higher age, say 21 years, the estimates do not change significantly for occupational and educational mobility (columns 6 and 8). Therefore, there is evidence for India that the impact of family background characteristics on occupational and educational attainment goes beyond the parental generation.¹⁸

	Table	$\sim 2.$ mung	generatic		ipational &	Euucationa	ii wiodiiity	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	G2 occ.	G3 occ.	G2 edu.	G3 edu.	G3 occ. ≥ 18	G3 occ. ≥ 21	G3 edu. ≥ 18	G3 edu. ≥ 21
Gen 1 occ.	0.423***				0.123***	0.118***		
	(0.00754)				(0.00971)	(0.0118)		
Gen 2 occ.		0.461***			0.422***	0.426***		
		(0.00806)			(0.00863)	(0.0105)		
Gen 1 edu.			0.587***				0.0649***	0.0696***
			(0.00739)				(0.00739)	(0.00900)
Gen 2 edu.				0.356***			0.334***	0.349***
				(0.00503)			(0.00562)	(0.00687)
Constant	1.729***	1.594***	2.173***	4.118***	1.323***	1.370***	4.066***	3.984***
	(0.0265)	(0.0273)	(0.0181)	(0.0194)	(0.0344)	(0.0425)	(0.0202)	(0.0246)
Obs.	19592	13970	25341	25341	13907	10333	25341	17688

 Table 2: Multigenerational Occupational & Educational Mobility

Note: standard errors in parentheses. * p < 0.05, ** p < 0.01, *** p < 0.001. Source: authors' compilation based on IHDS data.

¹⁸ Our finding that the grandfather's occupation matters, even after controlling for the father's occupation, is similar to that of Long and Ferrie (2018) for Britain and the USA, which is one of the few studies to examine multigenerational mobility.

We next look into the DD estimation results using equation (4). Table 3 presents the estimation results. The first half of the table provides the estimates of equation (3) for occupational and educational mobility for different 'treatment' groups-first, Muslims, next SC/ST, followed by urban residents, and, finally, OBCs. The second half of the table provides the mean values of occupational ranks and educational attainment levels 'pre-treatment' and 'post-treatment' for the 'treatment' and 'control' groups. Columns 1 and 2 present estimates for Muslims relative to Hindus, first for education and then for occupation. If we look at the first column, time (λ) captures the change in educational attainment for the 'control' group (Hindus) between 'pre-treatment' (T_0) and 'treatment' (T_1) periods. Muslim (γ) captures the change in educational attainment between the 'control' group (Hindus) and the treated group (Muslims) during the 'pre-treatment' (T_0) period. ρ captures the group and time $S_{ii} * G_{ii}$ interaction effect (the DID term), which is the difference of change in educational attainment for the 'treatment' group (Muslims) between the 'pre-treatment' (T_0) and 'treatment' (T_1) periods, relative to the change in the educational attainment for the 'control' group between the 'pre-treatment' (T_0) and 'treatment' (T_1) periods. The constant term (α) captures the average educational attainment of the 'control' group in the 'pre-treatment' (T_0) period.

For columns 3 and 4, SC/ST (γ) captures the change in educational attainment between the 'control' group (General Castes) and the treated group (SC/ST) during the 'pre-treatment' (T_0) period. For columns 5 and 6, location (γ) captures the change in educational attainment between the 'control' group (rural) and the treated group (urban) during the 'pre-treatment' (T_0) period. Lastly, for columns 7 and 8, OBC (γ) captures the change in educational attainment between the 'control' group (General Castes) and the treated group (OBC) during the 'pre-treatment' (T_0) period. Finally, in all these cases, the coefficient (ρ) on the interaction term $S_{ij} * G_{ij}$ captures the 'treatment effect', where the 'treatment' group is SC/ST for columns 3 and 4, urban residents for columns 5 and 6, and OBC for columns 7 and 8.

The second half of Table 3 presents the mean values of 'control' and 'treatment' groups at time T_0 (that is, generations 1 and 2) and time T_1 (that is, generation 3), and the differences between these mean values at time T_0 and time T_1 . That is, we are comparing the differences of educational attainment/occupational ranking of Muslims, SC/ST, OBC, and urban residents with those of Hindus, General Castes (who are the 'control' group for both SC/ST and OBC), and rural residents for generations 1 and 2 with generation 3.

	~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~				-			
Variables	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
	G3 edu	G3 occ.	G3 edu.	G3 occ.	G3 edu.	G3 occ.	G3 edu.	G3 occ.
Time ( $\lambda$ )	2.269***	0.0212	1.952***	0.00511	2.378***	-0.0961***	1.952***	0.00511
	(0.0142)	(0.0163)	(0.0228)	(0.0260)	(0.0159)	(0.0172)	(0.0228)	(0.0260)
Muslim ( $\gamma$ )	-0.346***	-0.00737						
-	(0.0269)	(0.0260)						
Group*Time ( $\rho$ )	-0.422***	-0.0949**	0.426***	-0.0413	-0.525***	0.378***	0.272***	0.0268
(rel,caste,location)	(0.0429)	(0.0454)	(0.0333)	(0.0370)	(0.0271)	(0.0310)	(0.0308)	(0.0345)
SC/ST ( $\gamma$ )			-1.228***	-1.159***				
,			(0.0225)	(0.0197)				
Location $(\gamma)$					1.176***	0.584***		
					(0.0185)	(0.0172)		
OBC $(\gamma)$							-0.798***	-0.606***
							(0.0219)	(0.0184)
Constant ( $\alpha$ )	2.761***	3.040***	3.428***	3.639***	2.326***	2.845***	3.428***	3.639***
	(0.00991)	(0.00885)	(0.0176)	(0.0139)	(0.00955)	(0.00936)	(0.0176)	(0.0139)
	(	(,	(		(,	(,	(	(
Observations	85,020	72,579	54,187	45,995	91,288	77,715	64,684	54,523
Mean control $(T_0)$	2.761	3.040	3.428	3.639	2.326	2.845	3.428	3.639
Mean treated $(T_0)$	2.414	3.033	2.200	2.480	3.502	3.429	2.630	3.033
Diff $(T_0)$	-0.346	-0.00737	-1.228	-1.159	1.176	0.584	-0.798	-0.606
Mean control $(T_1)$	5.030	3.061	5.380	3.644	4.704	2.749	5.380	3.644
Mean treated $(T_1)$	4.262	2.959	4.578	2.444	5.356	3.711	4.854	3.065
Diff $(T_1)$	-0.768	-0.102	-0.802	-1.200	0.651	0.963	-0.526	-0.579
-								

Table 3: Multigenerational Education and Occupational Mobility DD

Robust standard errors in parentheses clustered at the household level.

*** p<0.01, ** p<0.05, * p<0.1

From Table 3, if we look at columns 1 and 2 we see that, over time, the average educational and occupational attainment for the 'control' group (Hindus) has increased by 2.269 (from 2.761 to 5.030) and 0.0212 (from 3.040 to 3.061), respectively. For the 'pretreatment' ( $T_0$ ) (generations 1 and 2), the 'treated' group (Muslims) in comparison to the 'control' group (Hindus) on average has lower educational and occupational attainments by 0.346 and 0.0073, respectively. These increase to 4.262 and 2.959 in generation 3. However, the increase in occupational ranking and educational attainment for Muslims is not as much as those for Hindus over the three generations. Therefore, the coefficient ( $\rho$ ) of the interaction terms  $S_{ij} * G_{ij}$  is negative and significant for both education and occupation in columns 1 and 2, respectively. This implies that Muslims have seen weakening intergenerational mobility over time in education and occupations compared to Hindus. Our results imply that Muslims over time on average have lower educational and occupational attainment by 0.422 and 0.0949 points in comparison to Hindus, captured by  $\rho$ .

Columns 3 and 4 presents estimates for SC/ST relative to General Castes, first for education and then for occupation. We find that over time the average educational and occupational attainment for the 'control' group (General Castes) has increased by 1.952 (from 3.428 to 5.380) and 0.0051 (from 3.639 to 3.644), respectively. For the 'pre-treatment' ( $T_0$ ) period, the 'treated' group (SC/ST) in comparison to the 'control' group (General Castes) on average has a lower educational attainment and occupational ranking by 1.228 and 1.159, respectively. However, the difference in educational attainment between SC/ST and General Castes narrowed in the treatment period ( $T_1$ ) to 0.802, but increased for occupational ranking to 1.200. Therefore, we see that educational mobility has increased for SC/ST relative to General Castes over the three generations, with the coefficient on the interaction effect positive and significant—there is a 0.426 point increase in occupational ranking for SC/ST compared to General Castes. In contrast, there is no evidence of increased occupational mobility across generations for SC/ST—the interaction term for the occupational mobility estimate (column 4) is statistically insignificant (and negative). Our finding of an increase in educational mobility for SC/ST relative to General Castes over the three generations is consistent with the finding of higher educational mobility for SC in the work of Asher et al. (2020) in the two-generation case. On the other hand, our findings on the lack of an increase in occupational mobility in the multigenerational case contrasts with the finding of greater occupational mobility among SC/ST by Azam (2015) in the two-generation case.¹⁹

We next look at educational and occupational mobility across the three generations for urban versus rural residents. Columns 5 and 6 present estimates for the urban group relative to the rural group, first for education and then for occupation. We see that over time the average educational attainment for the rural group has increased by 2.378 (from 2.326 to 4.704), but occupational attainment has decreased by 0.0961 (from 2.845 to 2.749). For the 'pre-treatment'  $(T_0)$  period, the urban group has a higher education and occupational attainment by 1.176 and 0.584, respectively. However, over time the urban group in comparison to the rural group on average has a lower educational attainment by 0.525 but a higher occupational attainment of 0.378, which is captured by  $\rho$ . Therefore, we find that multigenerational educational mobility has weakened for urban residents relative to rural residents (the coefficient on the interaction term is negative and significant), while occupational mobility has increased (the coefficient on the interaction term is positive and significant). The weakening of educational mobility can be attributed to the fact that there has been a large increase in schooling in rural India over time, which means children in rural households have been receiving more education, catching up to the schooling levels of children in urban households (Drèze and Kingdon, 2001).

Finally, we look at multigenerational educational and occupational mobility of OBCs compared to General Castes in columns 7 and 8, respectively. Columns 7 and 8 present estimates for OBC relative to General Castes, first for education and then for occupation. We see that over time the average educational and occupational attainment for General Castes has increased by 1.952 (from 3.428 to 5.380) and 0.00511 (from 3.639 to 3.644), respectively. For the 'pre-treatment' ( $T_0$ ) period, OBC caste in comparison to the general caste on average has a lower educational and occupational attainment by 0.798 and 0.606, respectively. Similar to the case of SC/ST, we find that multigenerational educational mobility of OBC has increased relative to General Castes, but not occupational mobility, with the coefficient on the interaction term for educational mobility being positive and significant, while that for occupational mobility is statistically insignificant.

# 6.1 Robustness Test - Intergenerational Correlations (IGC) in Occupation and Education

An alternate estimate of intergenerational mobility is the IGC, which is the product of the IGRC and the ratio of standard deviation of the parent's educational attainment/occupation

¹⁹ Azam (2015) finds that SC/ST born in the period 1965–84 experience greater occupational mobility compared with the entire 1965–84 cohort or higher castes born in the period 1965–84.

rank to the standard deviation of the child's educational attainment/occupational rank (see equation (5) in Appendix B for more details). One well-known weakness of the IGRC is that it does not distinguish between changes in the mean and variance of the outcome distribution and changes in the rank ordering of the outcome distribution. Therefore, if the rank order of outcomes is preserved over generations but the variance of outcomes decreases over time, this may lead to a decrease in the IGRC, suggesting greater mobility. In the case of educational attainment in particular, this may be due to an increase in the overall level of educational attainment in society over time, leading to variance in the educational attainment of sons being less than that of their parent. Such a fall in IGRC, in this case, would not suggest true intergenerational mobility in education.

To guard against this possibility of a spurious finding of greater mobility for son–father pairs compared to father–grandfather pairs, we calculate IGCs for occupation and education by generation for the whole sample and then by group. We present the results in Appendix Tables A8–A11. We find lower IGC estimates in comparison to IGRC estimates between father–son and grandfather–son pairs for occupation, while for education we obtain lower IGC for grandfather–son pairs but higher for father–son pairs. In comparison to urban areas, we find lower IGC estimates for both occupation and education for rural areas for father–son pairs, while we obtain higher IGC estimates for grandfather–son pairs in occupation but lower for education. In comparison to Hindus, we find higher IGC estimates for occupation but lower for education for the father–son pairs of Muslims, and lower IGC estimates for grandfather–son pairs in occupation but higher in education. In comparison to General Castes, we find lower IGC estimates for OBC and SC/ST for both occupation and education among both father–son and grandfather–son pairs.

# 7 Conclusions

In this paper, we examine three-generation educational and occupational mobility in India using a nationally representative data set—the IHDS—that contains information about education and occupation for three generations. We are able to utilize this unusually rich data set, by developing-country standards, to obtain estimates of son–father and son–grandfather mobility. Further, we exploit the fact that the data spans three generations over time and assess whether multigenerational mobility in India has changed for socially disadvantaged groups and urban residents, relative to their comparators, using an innovative DD method.

Overall, we find that multigenerational mobility has increased over time for education but not for occupation. Educational mobility is higher for the son–father pair than the father–grandfather pair. In contrast, there is little difference in occupational mobility between the son–father and father–grandfather pairs. We also find clear evidence of a 'grandfather' effect—the grandfather's occupational and educational status has an effect on the grandson's occupational and educational status, independent of the father's.

Further, the findings by social group suggest a murky picture of social mobility in India. We find that multigenerational mobility for Muslims in education and occupation has decreased in comparison to that of Hindus. While we find that multigenerational mobility for SC/ST and OBC in education has increased relative to General Castes, we do not find evidence of increased occupational mobility over the three generations for SC/ST/OBC relative to General Castes. Given the roll-out of affirmative action programmes in India since independence for the SC and ST, and for OBC since the early 1990s, the lack of progress on occupational mobility for these socially disadvantaged groups is a matter of policy concern, especially given the high prevalence of poverty among the SC and ST in particular (Gang et al., 2017). Finally, we find that the role of location is equivocal, with more occupational mobility seen for urban residents compared to rural residents over three generations, but less mobility when it comes to education.

Our findings suggest that a multigenerational perspective may provide richer insights into the persistence of economic and social status across generations than the two-generation approach commonly used in the study of social mobility. This may be particularly relevant in the developing-country context, where dynastic effects last for several generations, and where there are deep-rooted social and economic causes of the lack of intergenerational mobility (Iversen et al., 2019). Therefore, an explicit focus on the transmission of outcomes from parent to child without considering the influence of grandparent and further-removed generations may vastly overstate the extent of intergenerational mobility in developing countries.

Our study is not able to assess the causes of limited multigenerational mobility for socially disadvantaged groups in India, and why affirmative action programmes have not delivered social progress in the way they were originally intended to. In the social mobility literature, a range of factors from credit constraints on human capital investment, peer effects, and neighbourhood effects have been seen as the drivers of intergenerational persistence of economic and social status (Iversen et al., 2019; Chetty et al., 2016; Alesina et al., 2021). Further research is needed to understand the causal factors behind the strengthening of the inequalities of opportunity that socially disadvantaged groups in India face, even in the context of rapid economic development.

# References

- Alesina, A., S. Hohmann, S. Michalopoulos, and E. Papaioannou (2021). Intergenerational mobility in africa. *Econometrica* 89(1), 1–35.
- Armstrong, W. A. (1972). The use of information about occupation. *Nineteenth-century society: essays in the use of quantitative methods for the study of social data*, 191–310.
- Asher, S., P. Novosad, and C. Rafkin (2020). Intergenerational mobility in india: Estimates from new methods and administrative data.
- Azam, M. (2015). Intergenerational occupational mobility among men in india. *The Journal* of *Development Studies* 51(10), 1389–1408.
- Azam, M. and V. Bhatt (2015). Like father, like son? intergenerational educational mobility in india. *Demography* 52(6), 1929–1959.
- Bayly, S. (1999). *Caste, Society and Politics in India from the Eighteenth Century to the Modern Age*. The New Cambridge History of India. Cambridge University Press.
- Becker, G. S. and N. Tomes (1979). An equilibrium theory of the distribution of income and intergenerational mobility. *Journal of political Economy* 87(6), 1153–1189.

- Beteille, A. (1992). *The backward classes in contemporary India*. Oxford University Press Delhi.
- Black, S. E. and P. J. Devereux (2010). Recent developments in intergenerational mobility.
- Blanden, J. (2013). Cross-country rankings in intergenerational mobility: a comparison of approaches from economics and sociology. *Journal of Economic Surveys* 27(1), 38–73.
- Bossuroy, T. and D. Cogneau (2013). Social mobility in five a frican countries. *Review of Income and Wealth* 59, S84–S110.
- Chetty, R., N. Hendren, and L. F. Katz (2016). The effects of exposure to better neighborhoods on children: New evidence from the moving to opportunity experiment. *American Economic Review 106*(4), 855–902.
- Chetty, R., N. Hendren, P. Kline, and E. Saez (2014). Where is the land of opportunity? the geography of intergenerational mobility in the united states. *The Quarterly Journal of Economics 129*(4), 1553–1623.
- Corak, M., M. J. Lindquist, and B. Mazumder (2014). A comparison of upward and downward intergenerational mobility in canada, sweden and the united states. *Labour Economics 30*, 185–200.
- Desai, S. and R. Vanneman (2015). *India human development survey-ii (ihds-ii), 2011-12.* Inter-university Consortium for Political and Social Research Ann Arbor, MI.
- Drèze, J. and G. G. Kingdon (2001). School participation in rural india. *Review of Development Economics* 5(1), 1–24.
- Emran, M. S., W. Greene, and F. Shilpi (2018). When measure matters coresidency, truncation bias, and intergenerational mobility in developing countries. *Journal of Human Resources* 53(3), 589–607.
- Erikson, R., J. H. Goldthorpe, and J. H. Goldthorpe (1992). *The constant flux: A study of class mobility in industrial societies.* Oxford University Press.
- Ferreira, F. H., J. Messina, J. Rigolini, L.-F. López-Calva, M. A. Lugo, and R. Vakis (2012). *Economic mobility and the rise of the Latin American middle class*. The World Bank.
- Funjika, P., R. M. Gisselquist, et al. (2020). Social mobility and inequality between groups.
- Gang, I. N., K. Sen, and M.-S. Yun (2008). Poverty in rural india: Caste and tribe. *Review of Income and Wealth* 54(1), 50–70.
- Gang, I. N., K. Sen, and M.-S. Yun (2011). Was the mandal commission right? differences in living standards between social groups. *Economic and Political Weekly* 46(39), 24.
- Gang, I. N., K. Sen, and M.-S. Yun (2017). Is caste destiny? occupational diversification among dalits in rural india. *The European Journal of Development Research 29*(2), 476–492.
- Ganzeboom, H. B. and D. J. Treiman (1996). Internationally comparable measures of occupational status for the 1988 international standard classification of occupations. *Social science research 25*(3), 201–239.

- Güell, M., J. V. Rodríguez Mora, and G. Solon (2018). New directions in measuring intergenerational mobility: Introduction. *The Economic Journal 128*(612), F335–F339.
- Heath, A. and Y. Zhao (2021). Rethinking occupational mobility in developing countries: conceptual issues and empirical findings. In V. Iversen, A. Krishna, and K. Sen (Eds.), *Social Mobility in Developing Countries: Concepts, Methods and Determinants*. Oxford: Oxford University Press.
- Hertz, T., T. Jayasundera, P. Piraino, S. Selcuk, N. Smith, and A. Verashchagina (2008). The inheritance of educational inequality: International comparisons and fifty-year trends. *The BE Journal of Economic Analysis & Policy* 7(2).
- Hnatkovska, V., A. Lahiri, and S. Paul (2012). Castes and labor mobility. *American Economic Journal: Applied Economics* 4(2), 274–307.
- Hnatkovska, V., A. Lahiri, and S. B. Paul (2013). Breaking the caste barrier intergenerational mobility in india. *Journal of Human Resources* 48(2), 435–473.
- Hodge, R. W., P. M. Siegel, and P. H. Rossi (1964). Occupational prestige in the united states, 1925-63. *American Journal of Sociology* 70(3), 286–302.
- Iversen, V., A. Krishna, and K. Sen (2019). Beyond poverty escapes—social mobility in developing countries: A review article. *The World Bank Research Observer* 34(2), 239–273.
- Iversen, V., A. Krishna, K. Sen, et al. (2016). Rags to riches? intergenerational occupational mobility in india. Technical report, GDI, The University of Manchester.
- Krishna, A. (2014). Examining the structure of opportunity and social mobility in india: Who becomes an engineer? *Development and Change* 45(1), 1–28.
- Li, Y. (2021). Social mobility in china: a case study of social mobility research in the global south. In V. Iversen, A. Krishna, and K. Sen (Eds.), *Social Mobility in Developing Countries: Concepts, Methods and Determinants*. Oxford: Oxford University Press.
- Long, J. and J. Ferrie (2018). Grandfathers matter (ed): occupational mobility across three generations in the us and britain, 1850–1911. *The Economic Journal 128*(612), F422–F445.
- Mohammed, A. S. (2019). Does a good father now have to be rich? intergenerational income mobility in rural india. *Labour Economics* 60, 99–114.
- Narayan, A., R. Van der Weide, A. Cojocaru, C. Lakner, S. Redaelli, D. G. Mahler, R. G. N. Ramasubbaiah, and S. Thewissen (2018). *Fair Progress?: Economic Mobility Across Generations Around the World*. World Bank Publications.
- Solon, G. (1999). Intergenerational mobility in the labor market. In *Handbook of labor economics*, Volume 3, pp. 1761–1800. Elsevier.
- Solon, G. (2004). A model of intergenerational mobility variation over time and place. *Generational income mobility in North America and Europe 2*, 38–47.
- Solon, G. (2014). Theoretical models of inequality transmission across multiple generations. *Research in Social Stratification and Mobility* 35, 13–18.

- Solon, G. (2018). What do we know so far about multigenerational mobility? *The Economic Journal 128*(612), F340–F352.
- Williamson, J. G. (1982). The structure of pay in britain, 1710-1911. *Research in Economic History* 7(esp. 48).
- Wu, X. and D. J. Treiman (2007). Inequality and equality under chinese socialism: The hukou system and intergenerational occupational mobility. *american Journal of sociology 113*(2), 415–445.
- Zhao, Y. and Y. Li (2017). Double disadvantages: a study of ethnic and hukou effects on class mobility in china (1996-2014). *Social Inclusion* 5(1), 5–19.

# A Appendix

# A.1 Tables

# Occupational mobility

		Generation 2														
Generation 1	Professionals		Cle	erical	Farmers		High s	High skilled labor		illed labor	Agri. & other labor		Total			
	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %		
Professionals	291	39.1	193	25.9	79	10.6	69	9.3	55	7.4	58	7.8	745	100.0		
Clerical	223	14.4	851	54.9	87	5.6	129	8.3	156	10.1	103	6.6	1,549	100.0		
Farmers	555	5.7	934	9.6	4,501	46.3	518	5.3	607	6.2	2,598	26.7	9,713	100.0		
High skilled labor	123	12.4	175	17.6	97	9.8	370	37.3	121	12.2	107	10.8	993	100.0		
Low skilled labor	120	7.7	217	13.9	84	5.4	142	9.1	762	48.8	235	15.1	1,560	100.0		
Agri. & other labor	189	3.8	473	9.4	618	12.3	293	5.8	566	11.2	2,893	57.5	5,032	100.0		
Total	1,501	7.7	2,843	14.5	5,466	27.9	1,521	7.8	2,267	11.6	5,994	30.6	19,592	100.0		

Table A1: Occupational mobility between G1 and G2

	Generation 3													
Generation 2	Professionals Clerica		erical	Far	mers	High s	killed labor	Low skilled labor		Agri. &	other labor	Total		
	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %
Professionals	349	46.1	127	16.8	91	12.0	68	9.0	65	8.6	57	7.5	757	100.0
Clerical	188	10.8	837	48.1	132	7.6	166	9.5	213	12.2	203	11.7	1,739	100.0
Farmers	369	8.3	442	10.0	1,743	39.4	351	7.9	411	9.3	1,112	25.1	4,428	100.0
High skilled labor	89	9.5	168	17.9	90	9.6	308	32.9	145	15.5	136	14.5	936	100.0
Low skilled labor	94	6.3	202	13.6	76	5.1	184	12.3	672	45.1	262	17.6	1,490	100.0
Agri. & other labor	188	4.1	338	7.3	399	8.6	359	7.8	563	12.2	2,773	60.0	4,620	100.0
Total	1,277	9.1	2,114	15.1	2,531	18.1	1,436	10.3	2,069	14.8	4,543	32.5	13,970	100.0

Table A2:	Occupational	l mobility betweer	G2 and G3
-----------	--------------	--------------------	-----------

-	Generation 3													
Generation 1	Professionals		Cle	erical	Farmers		High skilled labor		Low skilled labor		Agri. & other labor		Total	
	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %
Professionals	244	36.4	159	23.7	45	6.7	81	12.1	84	12.5	58	8.6	671	100.0
Clerical	271	18.9	652	45.5	47	3.3	141	9.8	178	12.4	143	10.0	1,432	100.0
Farmers	831	9.2	1,184	13.2	2,522	28.1	736	8.2	1,023	11.4	2,689	29.9	8,985	100.0
High skilled labor	141	16.1	207	23.6	50	5.7	219	25.0	144	16.4	115	13.1	876	100.0
Low skilled labor	157	10.5	254	17.0	52	3.5	191	12.8	569	38.1	271	18.1	1,494	100.0
Agri. & other labor	328	7.1	535	11.5	280	6.0	522	11.3	749	16.2	2,221	47.9	4,635	100.0
Total	1,972	10.9	2,991	16.5	2,996	16.6	1,890	10.4	2,747	15.2	5,497	30.4	18,093	100.0

Table A3: Occupational mobility between G1 and G3

# **Educational mobility**

	Generation 2															
Generation 1	<2	2 yrs	2-	4 yrs	Pri	mary	Mi	ddle	Seco	ndary	Higher	r Secondary	High	ner Ed.	То	tal
	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %
<2 yrs	6,970	43.0	2,038	12.6	1,574	9.7	2,263	14.0	2,165	13.4	696	4.3	491	3.0	16,197	100.0
2-4 yrs	295	10.4	625	22.0	296	10.4	522	18.4	653	23.0	234	8.2	212	7.5	2,837	100.0
Primary	232	10.1	189	8.2	393	17.1	470	20.5	546	23.8	209	9.1	256	11.2	2,295	100.0
Middle	98	5.7	81	4.7	105	6.2	486	28.5	476	27.9	190	11.1	270	15.8	1,706	100.0
Secondary	42	3.1	22	1.6	40	2.9	109	8.0	649	47.8	184	13.6	311	22.9	1,357	100.0
Higher Secondary	7	2.0	3	0.9	5	1.4	16	4.6	87	25.1	124	35.8	104	30.1	346	100.0
Higher Ed.	77	12.8	31	5.1	17	2.8	23	3.8	115	19.1	68	11.3	272	45.1	603	100.0
Total	7,721	30.5	2,989	11.8	2,430	9.6	3,889	15.3	4,691	18.5	1,705	6.7	1,916	7.6	25,341	100.0

Table A4: Educational mobility between G1 and G2

	Generation 3															
Generation 2	<2	2 yrs	2	-4 yrs	Pri	mary	Mi	ddle	Seco	ndary	Higher	Secondary	High	er Ed.	То	tal
	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %
<2 yrs	1,101	14.3	466	6.0	612	7.9	1,542	20.0	1,484	19.2	787	10.2	1,729	22.4	7,721	100.0
2-4 yrs	147	4.9	189	6.3	165	5.5	531	17.8	790	26.4	427	14.3	740	24.8	2,989	100.0
Primary	91	3.7	71	2.9	170	7.0	434	17.9	600	24.7	356	14.7	708	29.1	2,430	100.0
Middle	75	1.9	93	2.4	138	3.5	570	14.7	984	25.3	773	19.9	1,256	32.3	3,889	100.0
Secondary	67	1.4	28	0.6	59	1.3	311	6.6	1,003	21.4	1,188	25.3	2,035	43.4	4,691	100.0
Higher Secondary	11	0.6	9	0.5	21	1.2	71	4.2	221	13.0	424	24.9	948	55.6	1,705	100.0
Higher Ed.	5	0.3	4	0.2	4	0.2	35	1.8	162	8.5	339	17.7	1,367	71.3	1,916	100.0
Total	1,497	5.9	860	3.4	1,169	4.6	3,494	13.8	5,244	20.7	4,294	16.9	8,783	34.7	25,341	100.0

Table A5: Educational mobility between G2 and G3

								Ge	neratio	n 3						
Generation 1	<2	2 yrs	2	-4 yrs	Pri	mary	Mi	ddle	Seco	ndary	Higher	Secondary	High	ier Ed.	То	tal
	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %	Ν	Row %
<2 yrs	1,335	8.2	690	4.3	903	5.6	2,641	16.3	3,406	21.0	2,526	15.6	4,696	29.0	16,197	100.0
2-4 yrs	59	2.1	84	3.0	114	4.0	343	12.1	712	25.1	520	18.3	1,005	35.4	2,837	100.0
Primary	42	1.8	41	1.8	87	3.8	242	10.5	471	20.5	416	18.1	996	43.4	2,295	100.0
Middle	30	1.8	29	1.7	36	2.1	150	8.8	308	18.1	350	20.5	803	47.1	1,706	100.0
Secondary	11	0.8	11	0.8	15	1.1	72	5.3	212	15.6	304	22.4	732	53.9	1,357	100.0
Higher Secondary	3	0.9	0	0.0	4	1.2	7	2.0	45	13.0	85	24.6	202	58.4	346	100.0
Higher Ed.	17	2.8	5	0.8	10	1.7	39	6.5	90	14.9	93	15.4	349	57.9	603	100.0
Total	1,497	5.9	860	3.4	1,169	4.6	3,494	13.8	5,244	20.7	4,294	16.9	8,783	34.7	25,341	100.0

Table A6: Educational mobility between G1 and G3

## Table A7: Occupational codes

#### PROFESSIONAL, TECHNICAL, AND

#### RELATED WORKERS

00 Physical Scientists

- 01 Physical Science Technicians
- 02 Architects, Engineers, Technologists, and Surveyors
- 03 Engineering Technicians
- 04 Aircraft and Ships Officers
- 05 Life Scientists
- 06 Life Science Technicians
- 07 Physicians and Surgeons (Allopathic Dental and Veterinary Surgeons)
- 08 Nursing and Other Medical and Health Technicians
- 09 Scientific, Medical, and Technical Persons, Other
- 10 Mathematicians, Statisticians, and Related Workers
- 11 Economists and Related Workers
- 12 Accountants, Auditors, and Related Workers
- 13 Social Scientists and Related Workers
- 14 Jurists
- 15 Teachers
- 16 Poets, Authors, Journalists, and Related Workers
- 17 Sculptors, Painters, Photographers, and Related Creative Artists
- 18 Composers and Performing Artists
- 19 Professional Workers, n.e.c.

#### ADMINISTRATIVE, EXECUTIVE, AND MANAGERIAL WORKERS

- 20 Elected and Legislative Officials
- 21 Administrative and Executive Officials, Government and Local Bodies 22 Working Proprietors, Directors and Managers, Wholesale and Retail Trade
- 23 Directors and Managers, Financial Institutions
- 24 Working Proprietors, Directors and Managers Mining,
- Construction, Manufacturing, and Related Concerns
- 25 Working Proprietors, Directors, Managers and Related
- Executives, Transport, Storage, and Communication
- 26 Working Proprietors, Directors and Managers, Other Service
- 29 Administrative, Executive and Managerial Workers, n.e.c.

#### CLERICAL AND RELATED WORKERS

- 30 Clerical and Other Supervisors
- 31 Village Officials
- 32 Stenographers, Typists, and Card and Tape Punching Operators
- 33 Book-keepers, Cashiers, and Related Workers
- 34 Computing Machine Operators
- 35 Clerical and Related Workers, n.e.c.
- 36 Transport and Communication Supervisors
- 37 Transport Conductors and Guards
- 38 Mail Distributors and Related Workers
- 39 Telephone and Telegraph Operators

#### SALES WORKERS

- 40 Merchants and Shopkeepers, Wholesale and Retail Trade
- 41 Manufacturers, Agents
- 42 Technical Salesmen and Commercial Travellers
- 43 Salesmen, Shop Assistants, and Related Workers
- 44 Insurance, Real Estate, Securities, and Business Service
- Salesmen and Auctioneers
- 45 Money Lenders and Pawn Brokers
- 49 Sales Workers, n.e.c.

#### SERVICE WORKERS

- 50 Hotel and Restaurant Keepers
- 51 House Keepers, Matron, and Stewards (Domestic and Institutional) 52 Cooks, Waiters, Bartenders, and Related Worker (Domestic and Institutional)

Source: authors' compilation based on the NCO.

#### SERVICE WORKERS

- 53 Maids and Other House Keeping Service Workers n.e.c.
- 54 Building Caretakers, Sweepers, Cleaners, and Related Workers
- 55 Launderers, Dry-cleaners, and Pressers
- 56 Hair Dressers, Barbers, Beauticians, and Related Workers
- 57 Protective Service Workers
- 59 Service Workers, n.e.c.

#### FARMERS, FISHERMEN, HUNTERS, LOGGERS, AND RELATED WORKERS

- 60 Farm Plantation, Dairy and Other Managers and Supervisors
- 61 Cultivators
- 62 Farmers other than Cultivators
- 63 Agricultural Labourers
- 64 Plantation Labourers and Related Workers
- 65 Other Farm Workers
- 66 Forestry Workers
- 67 Hunters and Related Workers
- 68 Fishermen and Related Workers

#### PRODUCTION AND RELATED WORKERS, TRANSPORT EQUIPMENT OPERATORS AND LABOURERS

- 71 Miners, Quarrymen, Well Drillers, and Related Workers
- 72 Metal Processors
- 73 Wood Preparation Workers and Paper Makers
- 74 Chemical Processors and Related Workers
- 75 Spinners, Weavers, Knitters, Dyers, and Related Workers
- 76 Tanners, Fellmongers, and Pelt Dressers
- 77 Food and Beverage Processors
- 78 Tobacco Preparers and Tobacco Product Makers
- 79 Tailors, Dress Makers, Sewers, Upholsterers, and Related Workers
- 80 Shoe Makers and Leather Goods Makers
- 81 Carpenters, Cabinet and Related Wood Workers
- 82 Stone Cutters and Carvers
- 83 Blacksmiths, Tool Makers, and Machine Tool Operators
- 84 Machinery Fitters, Machine Assemblers, and Precision Instrument Makers (except Electrical)
- 85 Electrical Fitters and Related Electrical and Electronic Workers 86 Broadcasting Station and Sound Equipment Operators and Cinema Projectionists
- 87 Plumbers, Welders, Sheet Metal, and Structural Metal Preparers and Erectors
- 88 Jewellery and Precious Metal Workers and Metal Engravers (Except Printing)
- 89 Glass Formers, Potters, and Related Workers
- 90 Rubber and Plastic Product Makers

98 Transport Equipment Operators

X0 New Workers Seeking Employment

AA Housewife/Household work

BB Student/Too Young to Work CC Retired/Too Old to Work

28 DD Disabled/Unfit to Work

EE Out of Labour Force n.e.c

X9 Workers Not Reporting Any Occupation

- 91 Paper and Paper Board Products Makers
- 92 Printing and Related Workers
- 93 Painters

99 Labourers, n.e.c.

- 94 Production and Related Workers, n.e.c.
- 95 Bricklayers and Other Constructions Workers

WORKERS NOT CLASSIFIED BY OCCUPATIONS

X1 Workers Reporting Occupations Unidentifiable

- 96 Stationery Engines and Related Equipment Operators, Oilers and Greasers
- 97 Material Handling and Related Equipment Operators, Loaders and Unloaders

## A.2 IGC

To obtain the IGC estimate, we adjust the intergenerational regression coefficient (IGRC) estimated in equation 3 by the ratio of standard deviation of (grand) parental education (occupation) to that of the (grand) children's education (occupation).

$$IGC_{Parent}: \hat{\rho_1} = \hat{\beta_1} * (\frac{\sigma_p}{\sigma_c}),$$

$$IGC_{Grandparent}: \hat{\rho_2} = \hat{\beta_2} * (\frac{\sigma_g}{\sigma_c})$$
(5)

where  $\sigma_g$ ,  $\sigma_p$ ,  $\sigma_c$  are the standard deviations of the grandparent, parent and son's outcomes respectively. The parameter of interest is  $\hat{\rho}$ .

Table A8: Intergenerational Correlation (IGC)					
	G3 ocp ≥18	G3 ocp ≥21	G3 edu ≥18	G3 edu ≥21	
Gen 2	0.402***	0.403***	0.381***	0.387***	
	(0.00824)	(0.00989)	(0.00641)	(0.00732)	
Gen 1	0.105***	0.0988***	0.0562***	0.0584***	
	(0.00822)	(0.00988)	(0.00641)	(0.00728)	
Observations	13907	10333	25341	19359	

Standard errors in parentheses are calculated with the delta method using the nlcom command in STATA

* p < 0.05, ** p < 0.01, *** p < 0.001

	G3 ocp Urban	G3 ocp Rural	G3 edu Urban	G3 edu Rural	
Gen 2	0.437***	0.352***	0.461***	0.328***	
	(0.0162)	(0.00971)	(0.0103)	(0.00788)	
Gen 1	0.109***	0.115***	0.0680***	0.0460***	
	(0.0161)	(0.00964)	(0.0103)	(0.00788)	
Observations	3581	10326	8890	16451	

Table A9: Intergenerational Correlation (IGC) Location	able A9: Intergenerational Correlation (IGC) Location

Standard errors in parentheses are calculated with the delta method using the nlcom command in STATA

* p < 0.05, ** p < 0.01, *** p < 0.001

Table A11. Intergenerational Contention (IGC) Caste						
	G3 ocp general	G3 ocp OBC	G3 ocp SC/ST	G3 edu general	G3 edu OBC	G3 edu SC/ST
Gen 2	0.391***	0.390***	0.331***	0.409***	0.365***	0.319***
	(0.0157)	(0.0126)	(0.0158)	(0.0115)	(0.00964)	(0.0123)
Gen 1	0.104***	0.0698***	0.0748***	0.0698***	0.0423***	0.0379**
	(0.0164)	(0.0126)	(0.0152)	(0.0115)	(0.00964)	(0.0123)
Observations	3847	5984	4052	7847	10689	6731

Table A11: Intergenerational Correlation (IGC) Caste

Standard errors in parentheses are calculated with the delta method using the nlcom command in STATA

* p < 0.05, ** p < 0.01, *** p < 0.001

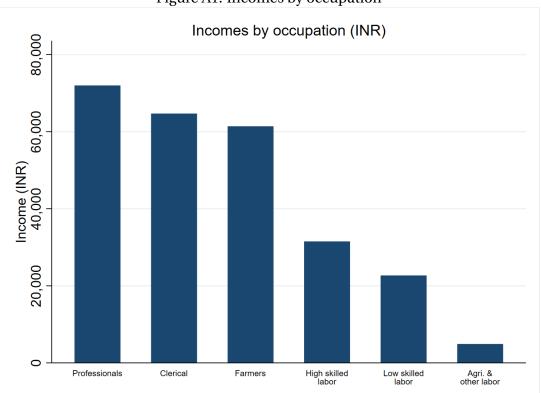
	Table A10: Intergenerational Correlation (IGC) Keligion				
	G3 ocp Hindu	G3 ocp Muslim	G3 edu Hindu	G3 edu Muslim	
Gen 2	0.399***	0.405***	0.372***	0.362***	
	(0.00916)	(0.0232)	(0.00722)	(0.0173)	
Gen 1	0.107***	0.0652**	0.0613***	0.0637***	
	(0.00916)	(0.0232)	(0.00722)	(0.0173)	
Observations	11317	1742	20242	3376	

Table A10: Intergenerational Correlation (IGC) Religion

Standard errors in parentheses are calculated with the delta method using the nlcom command in STATA

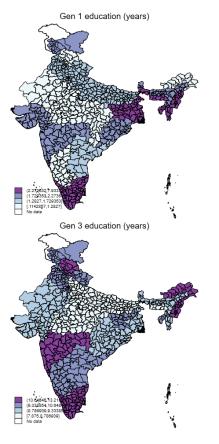
* p < 0.05, ** p < 0.01, *** p < 0.001

# A.3 Graphs

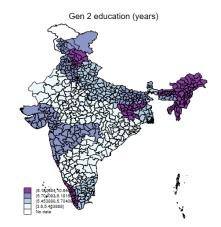


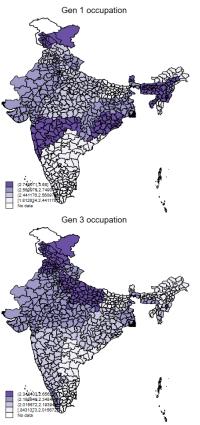
## Figure A1: Incomes by occupation

Note: Gen 2 Income



# Figure A2: Educational attainment over generations across states





# Figure A3: Occupational attainment over generations across states Gen 1 occupation Gen 2 occupation

