# The Long Term Benefits of Vaccination Campaigns: Evidence from Measles * 

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#### Abstract

We investigate the long term impacts of a reduction in measles stemming from a nationwide immunization program in Mexico. The vaccination program led to significant improvements in childhood health as measles causes "immune amnesia", leaving infected individuals susceptible to illness from other diseases for several years. Using a difference-in-differences strategy we find the measles vaccine led to large increases in educational attainment, employment, and income for men. The effects are two to ten times larger than in the U.S. This shows disease eradication can have a larger effect in middle income countries like Mexico with a greater disease burden and reduced health care access. The educational increases also are greater than for malaria and hookworm. This is attributed to the universality of measles as a childhood disease, and the widespread health improvements generated by the vaccine.


Keywords: Measles, Mexico, Employment, Education, Migration

## JEL Codes: I15, J24, O15

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## 1 Introduction

Are there long term benefits to vaccination campaigns that reduce the prevalence of infectious disease? We examine this question using the case of Mexico and its rollout of the measles vaccine in the 1970s. Measles offers an important example of a disease whose reduction may lead to long term improvements for two reasons. First, it is highly contagious, and prior to the invention and adoption of the measles vaccine it was a universal childhood disease. An estimated $95 \%$ of children contracted it before age 16 (Atwood 2022). Second, measles is unlike other infectious diseases in that it causes "immune amnesia", which reduces immunity from other diseases (Mina 2015). It can take several years for the immune system to recover, thereby increasing morbidity beyond the effects of measles alone. These two factors combined mean that the measles vaccine leads to improvements in childhood health for large segments of the population.

Several papers have documented positive, short-term, effects of the measles vaccine on public health (Aaby et al. 1984; Aaby et al. 2003; Aaby et al. 2014; Bloch et al. 1985; du Lou et al. 1995; Gadroen et al. 2018; Hinman et al. 1983; Mina et al. 2015). These papers find the introduction of mass measles vaccination has a profound impact on not only measles but on morbidity and mortality from other infectious diseases. A small number of recent papers examine the long-run economic impacts of the measles vaccine. In the U.S. Atwood (2022) and Chuard et al. (2022) finds positive long-run effects on labor market outcomes. In Burkina Faso, Daramola, Hossain and Harounan (2022) find the measles vaccination campaign increased primary school completion and employment as an adult. While Summan, Nandi, and Bloom (2022), find increased income as adults for those exposed to the Universal Immunization Programme (UIP) in India. This complements a large literature that finds positive long-run effects on employment and wages from the eradication of other diseases, principally malaria.

Less work has been done investigating the long run effects of the measles vaccine in middle income countries like Mexico. Filling this gap in the literature is important, as the effects of
mass vaccination campaigns likely were greater than in high income countries. This is due to the fact that while the incidence of measles does not vary, the burden of the disease does due to the higher incidence of other infectious diseases coupled with less access to health care providers. For example, prior to the rollout of the vaccine in Mexico, the country's director of the Institute for Vaccines noted that the pre-vaccine measles mortality rate was 10 times higher in Mexico than in the U.S. (Martín Sosa, 1970). Similarly, Bleakley (2010) finds the impact of campaigns to eradicate a different disease- malaria - were greater in Mexico, Brazil and Colombia than in the United States.

In this paper we examine Mexico's National Immunization Program (NIP), which began in 1973 and quickly administered millions of doses of the measles vaccine to young children throughout the country. We study the long run impacts of this program using a difference-indifferences empirical design which takes advantage of differential exposure to the vaccination campaign due to year of birth and cross area differences in pre-program measles incidence rates across states ${ }^{\top}$ In testing the parallel trends assumption of this design we show the National Immunization Program led to near complete reductions in measles incidence, and that the declines were larger in states with higher pre-program incidence. Meanwhile, similar declines and differences across high and low incidence measles states are not seen for outcomes that should be unaffected by the measles vaccine, but would be affected by general improvements in public health infrastructure. These include sexually transmitted diseases, diseases with pre-existing vaccines (polio, diphtheria, tuberculosis), diseases caused by poor sanitation (dysentery), and adult mortality from childbirth or accidents and homicides. We also show that state level income and geographic measures such as temperature or rainfall measures have no correlation with pre-vaccine measles rates. Instead the strongest predictors are the size of susceptible population, measured by young children who have not yet caught the disease, and differences in the timing of the school year. Schools are the main site of measles transmission, and rates are higher in states where the school calendar covers more

[^1]winter months.
Using five different Mexican datasets we find significant evidence that the measles vaccine improved educational attainment for men in Mexico. For affected cohorts schooling increased between 0.5 and 0.8 years. These increases are sufficient to drive changes in overall educational attainment, with men shifting out of completing only primary school or less and instead completing either lower or upper secondary school. The estimated changes are large, ranging from a eight and fifteen per cent increase in the attainment of higher education levels. These findings are striking not just due to their size, but because they differ from existing literature that generally finds no educational effects for men from the eradication of other infectious diseases. For example, Bleakley (2007) finds that eradication campaigns for hookworm in the American South had a positive impact on earnings but not did have a statistically significant impact on educational attainment. Likewise, there is substantial evidence that malaria eradication campaigns have impacts on income and household consumption but no evidence of impact on educational attainment for men (Bleakley 2010, Cutler et al. 2010, Venkataramani 2012). We argue the combination of disease and context explains these disparities. The universality of measles means that eradication campaigns affect a larger percent of the population than for malaria or hookworm. Meanwhile, weaker compulsory schooling laws in Mexico means that sickness in childhood could more easily translate into dropping out of school at younger ages. ${ }^{2}$

We also find that the measles vaccine improved labor market outcomes for men in Mexico. For affected cohorts the incidence of employment increased approximately two and a half percent while log wages increased between two and thirteen percent. These estimates are two to ten times larger than those found by Atwood (2022) and Chuard et al.(2022) in the U.S. This provides evidence that the long-term effects of the measles vaccine indeed are larger in countries with higher disease burdens. These labor market outcomes and those on education do not exhibit any evidence of pre-trends. To show this we test the relationship between

[^2]birth cohorts and our outcomes of interest and find a positive relationship for birth cohorts affected by the NIP and no effect for the cohorts not exposed to the NIP.

Finally we examine if improved educational attainment and labor market conditions in Mexico following the measles vaccine campaign affected international migration, almost all of which is to the U.S. The potential direction of change is unclear, as improved labor market conditions in Mexico may dampen migration incentives for those who reap the most benefits from the measles vaccine. This argument is in line with several papers which find migration is responsive to labor market conditions in Mexico (Orrenius and Zavodny 2005, Lessem 2018, and Monras 2020). On the other hand, we cover a time period when migration rates are high, and previous work by Hanson and McIntosh (2010) finds that migration increased among the age cohorts we study as a result of rising cohort size and labor supply.

Overall we find that among affected cohorts international migration does increase significantly, but only for those in areas with a history of high migration. This aligns with a story in which migration responses differ by access to migration networks, which provide information about expected labor market outcomes in the U.S. In other words, among the cohorts most affected by the vaccine, only individuals with better information about labor market conditions in the U.S. become more likely to migrate abroad.

Our paper makes two main contributions to the literature. First, we add to the large body of work which documents the long term benefits of reducing childhood health shock $\$^{3}$. We show that significant improvements in education, employment and wages can take place even when the disease leading to the health shocks has a low rate of mortality and long-term morbidity. These effects likely are larger in low and middle income countries, and highlight the advantages of growing up in a reduced disease environment.

Second, we provide additional documentation that vaccine campaigns which reduce the incidence of highly contagious disease can be extremely beneficial. Advertising these benefits

[^3]remains necessary, even for diseases like measles with long-standing immunization programs. Recently measles vaccination rates have declined due to increased vaccine hesitancy (Larson et al. 2022) and the decision by some countries to suspend measles vaccine campaigns during the Covid19 pandemic (Roberts 2020). As a result, globally measles cases rose from 2021 to 2022 (WHO 2022). These increases may not be benign, particularly in low and middle income countries. Our findings hopefully provide additional support for policy makers and public health officials attempting to restore previous immunization rates.

## 2 Measles

### 2.1 Measles Virus

Caused by a paramyxovirus, measles is one of the most contagious of all infectious diseases. The virus is transmitted through direct contact with infectious droplets and by airborne spread - primarily by infectious individuals coughing, sneezing, or breathing - with the virus remaining infectious for up to two hours after an infected individual leaves the area (Fields et al. 2013). Due to its highly contagious nature nine out of ten susceptible individuals with close contact to a measles patient will develop measles (Banerjee et al. 2019).$^{4}$

The classic symptom of measles is a rash that spreads over the body and is often accompanied by fever, runny nose, cough, red eyes, and sore throat (Fitzgerald et al. 2012; Fields et al. 2013; Robbins 1962). Measles patients are typically contagious during the four days preceding the appearance of the rash and for the first four days after the rash appears (Fields et al. 2013; Robbins 1962). Spreaders of the measles virus are typically in the pre-rash phase. This plus the highly contagious nature of measles allows for widespread infection before the spreader even knows they are contagious and for them to have exposed individuals without ever being in the room at the same time as each other.

Measles virus is a universal childhood disease. In the absence of the measles vaccination

[^4]virtually everyone will naturally be infected by measles during childhood. Prior to vaccine availability 50 -percent of all children will naturally contract measles by the age of 6 and 95-percent will naturally contract measles by the age of 16 (Atwood 2022; Perry and Halsey 2004; Langmuir 1962; Strebel 2017; Miller 1964). In the absence of a vaccine there is no method of measles prevention. Any individual without measles antibodies is susceptible to measles, while lifelong immunity is obtained upon recovery from measles (Fox 1983).

The measles vaccine is recognized as one of the most successful public health interventions of all time (Perry et al. 2014; Moss and Griffin 2012; Simons et al. 2012). This is due to the twofold impact of the measles vaccine. First, the measles vaccine reduces measles incidence. By reducing the number of measles cases at any given point in time the spread and likelihood of anyone unvaccinated contracting measles decreases. Second, preventing measles through vaccination also causes a reduction in morbidity and mortality from other pathogens due to the unique biology of the measles virus and its impact on our immune system. Following an infection our immune system is suppressed. This suppression is transient and our immune system restocks itself, to continue to provide future resistance to pathogens it had previously developed antibodies for, using its immune memory cells in the few weeks or months following illness (Perry et al. 2014; de Vries and de Stewart 2014; Schneider-Schaulies and Schneider-Schaulies 2009). However, the measles virus interacts differently with our immune system. Individuals who contract measles experience profound immunosuppression and are then susceptible to other pathogens (de Vries et al. 2012). Scientists have discovered that post measles infection one's body restocks memory cells within weeks but only restocks with measles-specific lymphocytes and not other antibodies that it had previously acquired. Therefore, the body must reacquire immunity through contact with antigens during this restocking period (Pirquet 1908; Lin et al. 2012). This phenomena has been termed "immune amnesia" and it can take up to five years for the immune system to be restocked. $5^{5}$

[^5]Recent epidemiological and medical literature has documented the impact of "immune amnesia". Gadroen et al. (2018) showed using cohort analysis that antimicrobial therapies were prescribed at an increased rate to children for up to five years post measles infection due to a greater number of infections attributable to measles related immunosupression. Another study demonstrated in the United States, Denmark, and England and Wales that non-measles infectious disease mortality is correlated with measles incidence over a twoto three-year lag period (Mina et al. 2015 ). Additionally, biological evidence of "immune amnesia" has been provided through two studies using pre- and post-natural measles infection which document the decrease post-infection in the body's immune memory cells. The studies use blood samples from children who are unvaccinated due to religious reasons in the Netherlands. One study documents previously formed memory cells went missing post measles infection (Petrova et al. 2019 ); and the other finds 11- to 73 -percent of a child's antibody repertoire missing (Mina et al. 2019 ).

Antibody recovery post-measles infection only occurs after natural re-exposure to the pathogens. Thus, "immune amnesia" can have a profound impact on health during childhood. Once mass measles vaccination occurs measles cases are virtually eliminated and children exposed to the vaccine will have healthier childhoods than those not exposed to the vaccine.

### 2.2 Measles in Mexico and the National Immunization Program

The history of measles in Mexico can be divided into four distinct periods. The earliest being 1950-1958. During this and subsequent periods outbreaks of measles occur on a two-year cycle that corresponds to when sufficient numbers of susceptible individuals accumulate. This period also sees a dramatic decrease in the death rate (while stable morbidity is exhibited during the period) which is attributed to the wide use of penicillin (de Castro 1983). During the next period, 1959-1966, the measles morbidity pattern remains consistent with the previous period and the mortality curve flattens, due to the broad spectrum use of antibiotics (de Castro 1983). During the third period, from 1967-1972, measles continues to
exhibit its bi-yearly epidemic pattern albeit at a slightly lower level than the previous two periods (de Castro 1983). ${ }^{6}$ It is important to note that the mortality rate remains consistent from this period to the previous one, an indicator that there were no additional advances to impact measles related mortality ${ }^{7}$

Mexico entered the fourth period when it launched the National Immunization Program in 1973, distributing the measles vaccine at no cost to children 89 The first phase of the program utilized a mass vaccination approach. In 1973 the program targeted children aged six months to five years and deployed vaccination brigades to make vaccines accessible (de Castro 1983). More than 3.6 million doses of the measles vaccine were administered to children aged nine months to five years in 1973 (Santos 2004). During the years 1974 and 1975 the program targeted children aged 6 months to 18 months but older children were not turned away if their family requested measles vaccination. The shift to more focused targeting of younger children in these years occurred because older children were included in the first year of the program (de Castro 1983). From 1976 to 1979 the National Immunization Program shifts its strategy to that of a routine immunization strategy through

[^6]health centers. To make the population aware of this shift and to encourage vaccination intensive advertising of the program occurred as well as the establishment of the Cartilla Nacional de Vacunación (National Immunization Card) in 1976 (de Castro 1983). Then in 1980-1989, the government continued with its routine immunization strategy but also introduced intensive phases of immunization (pop-up mass vaccination opportunities) during the year into the routine immunization strategy (de Castro 1983). ${ }^{10}$

The National Immunization Program was very successful in vaccinating its target populations (Bravo and Diaz 1980; de Castro 1983; Santos 2004). This is illustrated in Figures 1 and 2. Figure 1 shows both the number of reported measles cases and the number of measles deaths at the national level in Mexico over time. Prior to the government's mass measles immunization campaign the national incidence was roughly 40,000 reported cases a year ${ }^{11}$ and after the mass immunization campaign is implemented in 1973 there is a swift and near full reduction in measles cases $\sqrt{12}$ This is because the National Immunization Program was successful in vaccinating children against measles as measles morbidity is a direct mathematical function of the number of vaccine doses distributed (de Castro 1983). Mortality from measles also declined during this period as illustrated by the dashed line in Figure 1. ${ }^{13}$ Figure 2 illustrates the reduction in measles cases from 1972 (the year prior to the measles immunization campaign) to 1978 plotted against the number of measles cases in that state in 1972. If the measles vaccine is successful in preventing measles and the mass

[^7]vaccination campaign was successful we will observe a positive relationship in the figure. The data points in Figure 2 approximate a 45-degree line indicating the measles burden across the entire country was significantly reduced.

## 3 Data

### 3.1 Measles Incidence Rates

Annual state-level infectious disease incidence rate data come from the 1965 to 1978 annual epidemiological bulletins published in the Salud Pública de México. ${ }^{14}$ These data report the number of reported cases and incidence rate per 100,000 populations in each state during a given year for notifiable infectious diseases. Measles is a notifiable disease in Mexico during this time period. State population for each year is also included in these reports.

### 3.2 Outcome Variables

To estimate the long-run effects of the measles vaccine we use Mexican datasets that are representative at the state level, large enough to provide sufficient birth-year cohort variation and go back far enough to include when unaffected and affected cohorts reach the age to complete their schooling and enter the labor market. For example, the first cohorts to have maximum exposure to the measles vaccine were born in 1973, when the vaccine campaign began. Since we define age 18 as the age when individuals reach adulthood, individuals born in 1973 would reach that age in 1991. Meanwhile, individuals with zero exposure to the vaccine rollout before reaching the age of 18 were born on or before 1955.

[^8]Five datasets meet the criteria outlined above ${ }^{[15}$ The first two are the 1995 Mexican Intercensal Count (Conteo) and the 2000 Mexican Census. The last three are Mexican labor force surveys: the National Survey of Urban Employment (Encuesta Nacional de Empleo Urbano, or ENEU) the National Survey of Employment (Encuesta Nacional de Empleo, or ENE) and the National Survey of Employment and Occupation (Encuesta Nacional de Ocupación y Empleo, or $E N O E$ ). All three are panel datasets which follow individuals for up to five quarters. To avoid double counting we construct a cross-section such that each individual only appears once, using individuals' age as of the first interview and the remaining responses as of the last interview ${ }^{16}$ We use all three datasets as they vary in terms of timing and geographic coverage. The ENE and ENEU are the earlier samples and were replaced with the ENOE in 2005. For the ENE we use surveys from 2000 to 2004, while for the ENOE, to avoid including the Great Recession, we use surveys from 2005 to 2008. For the ENEU, we use all samples with state of birth information (1994 to 2004). Both the ENE and ENOE have greater geographic coverage, as they are representative of urban and rural areas, while the ENEU only includes urban areas.

Another key feature of all five datasets is that they have information on migrants and nonmigrants, and, given their size, can capture a low probability event like migration (National Research Council 2013). The Conteo and Census contain modules on international migration that ask households to list the members who have migrated abroad in the past five years and their age at migration. These questions allow us to see not only migrants who left Mexico and returned, but also those who left and remain abroad. ${ }^{17}$ For example, the 1995 Conteo covers migration incidents that occurred from 1990 to 1995- a time period when the first cohorts to receive the vaccine as infants (1973 and beyond) reach an age when they can decide to migrate as adults. Meanwhile, in the ENE, ENEU and ENOE households are

[^9]asked if any members listed in the first survey are absent because they moved abroad. These datasets therefore capture exactly who leaves from which Mexican location and how they compare to those who remain. We note that migration incidence differs across the Conteo and Census and the ENE, ENEU and ENOE, as the former capture stocks while the latter capture flows. In other words, the Conteo and Census capture the total number of men who have left in the previous five years, while the ENE, ENOE and ENEU capture the number of people who leave in one specific year. This means the migration numbers are larger for the Conteo and Census than for the other datasets ${ }^{18}$

To capture the population that is most likely to work we use men ages 18 to 65 . For wages we use real, monthly wage income, adjusting all income values so that they are in Q42004 pesos using the Index of National Consumer Prices, obtained through INEGI. For education, in addition to total years of schooling we also consider educational attainment, determined using data on the highest level of education reached plus the number of years at that level. We code three levels of attainment: primary school or less (0-8 years of education); lower secondary school ( 9 to 10 years of education); and upper secondary school and above (11 years of education or more) ${ }^{19}$ The distribution of years of education by dataset are presented in Figure A1. They show that the three attainment categories approximately capture the lower, middle and upper ends of the education distribution. At the upper end, the relative scarcity of workers with upper secondary and college education should lead to higher wages for those who obtain these levels of educational attainment. Meanwhile, the middle of the distribution is of interest because several papers document that Mexican migrants to the

[^10]U.S. largely are drawn from here (Chiquiar and Hanson 2005, Fernández-Huertas Moraga 2011, Rendall and Parker 2014). This means individuals with lower secondary education levels are more likely to compare labor market outcomes at home to those abroad.

Summary statistics from all five datasets are in Table 1, and show a high degree of similarity across the samples in terms of average age and employment status. Where we see differences is in wage income and education, which are higher in the all urban ENEU sample. For international migration we present a graph of flows by year or quarter-year from all five datasets in Appendix Figure A3. These demonstrate that the datasets cover time periods of large increases in outmigration (1990 to 2000), steady rates of outmigration (2000 to 2004) and declines in outmigration (2005 to 2008).

## 4 Empirical Model

### 4.1 Main Model Long Term Outcomes

Following Atwood 2022, our main model compares both across states and across cohorts taking advantage of variation in pre-vaccine incidence rates and differential exposure to the vaccine because of one's age. ${ }^{20}$.

$$
\begin{equation*}
Y_{i c s t}=\beta_{0}+\beta_{1}\left(M_{1965-1972}^{\text {pre }} * \text { Exposure }\right)_{c s}+\delta_{c}+\delta_{s}+\delta_{t}+\gamma * X_{i c s t}+\epsilon_{i c s t} \tag{1}
\end{equation*}
$$

Using a difference-in-differences specification we look at outcomes for individual $i$ in birth cohort $c$ at time $t$ in Mexican state s. $M_{1965-1972}^{p r e}$ is measured as an unweighted eight-year average of a state's measles incidence rate per 100,000 population. ${ }^{21}$ Chuard et al. 2022,

[^11]provides strong support for the use of reduced-form approaches that focus on the severity of the disease environment when measuring the long-term benefits of disease reductions. The average measles incidence before the vaccine and the incidence change due to the vaccine are equivalent as illustrated in Figure 2, therefore using either will yield the same results. We match adult individuals to the pre-vaccine measles incidence rate of their state of birth. ${ }^{22}$,
$M^{\text {pre }}$ is interacted with Exposure to allow for cross-cohort comparisons. Exposure to the vaccine is 16 for those born in 1973 or later, and decreases linearly for those born in the 16 years prior, and is zero for the older cohorts ${ }^{23} \beta_{1}$ provides the reduced form estimate of the differences in gains based on pre-vaccine measles rates for outcome $Y_{i c s t}$ for person $i$, born in state $s$, in cohort $c$, at year $t$. If measles adversely affects labor market and schooling outcomes, then cohorts with more exposure to the vaccine should experience better outcomes than those with less exposure to the vaccine in the same state.

The model also includes cohort fixed effects $\left(\delta_{c}\right)$, which control for characteristics consistent across the birth year cohort, and state-of-birth fixed effects $\left(\delta_{s}\right)$, which control for time invariant state characteristics. For the ENE, ENEU, and ENOE we also include survey year fixed effects $\left(\delta_{t}\right)$ to control for national level characteristics of a given year. $\gamma * X_{i c s t}$ are individual level controls, including marital and urban status. Standard errors are clustered at the level of exposure to the measles vaccine, which is state and year of birth ${ }^{24}$. Our analysis focuses on males between the ages of 18 and 65, as they significantly are more likely to be in the labor force and to migrate abroad than females.

### 4.2 Determinants of Disease Incidence

The difference-in-differences research design exploits variation across states based on prevaccine measles incidence rates and variation across cohorts based on specific years of

[^12]exposure to the measles vaccine. The primary identifying assumption is that in the absence of the mass measles vaccination program in Mexico the difference in outcomes across birth cohorts would have evolved similarly in higher- and lower-measles incidence rate states.

Several features of measles help support the parallel trends assumption. First, measles is a highly contagious disease in all contexts, and in the absence of a vaccine 95 - to 98 -percent of children will contract it by age 16. The universality of measles means that environmental factors which explain the incidence of mosquito borne diseases like malaria do little to explain the pre-vaccine incidence of measles. We provide some evidence of this in Figure 3, which illustrates the variation across Mexican states in measles incidence rates prior to the National Immunization Program of 1973. The map highlights the absence of any clear geographic trend in pre-vaccine measles rate. For example, rates are not uniformly higher among states that border the U.S., Guatemala, the Gulf of Mexico or the Pacific. In Table 2 we show the correlation between measles rates and geographic features in 1970 of the capital city of the state, including average temperature, days of significant rain, and annual precipitation. The results confirm there is no correlation between any of the measures and average, pre-vaccine measles rates. ${ }^{25}$

The nature of measles also means there should be a low correlation between pre vaccine incidence and the income or wealth in a state (although there would be a correlation to morbidity and mortality from the disease). We see some evidence of this if we look at the ranking of states by pre-vaccine measles incidence, (shown in Appendix Table A1), as wealthier and poorer states are equally represented in the high and low incidence groups. We also explicitly test for a correlation between average wage monthly wage income, employment and literacy rates in the 1970 census and the average pre-vaccine measles rate across states. The results in Table 3 show no correlation for all variables ${ }^{26}$

This leads to the question of what does determine variation in state-level measles rates

[^13]prior to the vaccine. The most important determinants are the size of the susceptible population, defined as children who have never had the measles, the density of that population in places where they would be exposed to the measles, and the timing of this exposure. ${ }^{27}$ For the first variable, a good measure for the rate at which these never exposed cohorts of young children enter the population is the fertility rate, which is available in the Annual Statisicals. As shown in Table 3, we find that average fertility rates are positively and significantly correlated with pre-vaccine measles rates.

In terms of where exposure happens, the primary site of measles transmission is schools. There is a long and extensive literature documenting a contagious individual in the classroom leads to explosive outbreaks immediately following the susceptible population's exposure (MMWR 1977; Hinman et al. 1983; Rota et al. 2016; Sencer, Dull, and Langmuir 1967; Hedrich 1930; Fine and Clarkson 1982). The intensity of measles outbreaks within schools, in turn, varies depending how the timing of the school year aligns with the timing of measles cycles. This is similar to that of the cold and flu, in that infections are worse in the winter months. How long children were in school during these months happened to vary across states in Mexico. This is because in the 1920s the Secretary of Education assumed control of all schools and assigned states to two different school calendar regimes: A and B (Alvarez Barret 1969). In calendar A states the school year ran from February to November, while in calendar B states the school year ran from September to June. This means that in calendar B states students spent more of the high infection winter months (December and January) in school while in calendar A states they did not ${ }^{28}$ The result is that pre-vaccine measles incidence is $17 \%$ higher in calendar B states than in calendar A ones ${ }^{29}$

One concern is whether or not the assignment to different school calendars is related to

[^14]climate. In theory the Secretary of Education assigned states to school calendars based on whether or not they were deemed temperate or tropical. However, in practice the assignment did not align with these definitions, and many dry, Northern states were assigned to calendar B (Baja California) while some wetter Southern states were assigned to calendar A (Veracruz) (Alvarez Barret 1969). Indeed, we find no correlation between any of our previous geographic measures and whether or not a state is in Calendar B. We also find no correlation between which school calendar a state has and their income per capita, literacy rates or years of schooling. Meanwhile, as shown in Table 3, there is a positive correlation between school calendar B and pre-vaccine measles rates. Overall the school calendar explains $5 \%$ of the total variation in pre-vaccine rates while income per capita explains only $1 \%$.

Finally, the absence of measles treatment and the high effectiveness of the vaccine means the mass measles vaccination campaign in 1973 was successful in reducing the measles burden in Mexico (as illustrated by Figure 1), but it is unlikely any intervention other than the measles vaccine would lead to a sharp and permanent decline in measles rates. Furthermore, given the universality of the measles and measles induced "immune amnesia", it is unlikely any other intervention at this time led to the same improvements in childhood health.

### 4.3 Event Studies

We conduct an event study analysis to provide more direct evidence supporting the parallel trends assumption. Following Atwood (2022), Goodman-Bacon (2017), and Jacobson et al. (1993) we use a standard event study model for state $s$ where pre- and post-treatment are defined by indicators variables that measure time to and time from Mexico's mass measles vaccination initiative in 1973, and treatment and control groups are represented by the continuous variable of the pre-vaccination measles rate in a state.

$$
\begin{equation*}
Y_{s t}=\beta_{0}+M_{1965-1972_{s}}^{p r e}\left[\sum_{y=-8}^{-2} \alpha_{y}(t-t *=y)+\sum_{y=0}^{6} \lambda_{y}(t-t *=y)\right]+\delta_{s}+\delta_{t}+\gamma * X_{s t}+\epsilon_{s t} \tag{2}
\end{equation*}
$$

$M_{1965-1972}^{\text {pre }}$ is measured as an unweighted eight-year average of a state's measles incidence rate per 100,000 population. We average over all the years of pre-vaccine data due to the 2- to 3- year cycle of measles epidemics, meaning that previous years measles outbreaks influence the current year susceptible population and number of cases. The time period used in the event study is from 1965 to 1978. We include state fixed effects to control for time invariant state level characteristics such as climate and unchanging infrastructure. The reference period is set to the year before the measles vaccine was licensed in Mexico and the government instituted a mass measles vaccination campaign. We include the time varying state population as a covariate. Standard errors are clustered at the state level.

The coefficients of interest are $\alpha_{y}$ and $\lambda_{y}$. These coefficients measure the covariate adjusted relationship between the incidence rate of measles and the unweighted average8 -year pre-vaccine measles incidence rate in the 8 years leading up to the mass vaccination initiative and the 6 years after. The indicator of the year prior to the vaccination campaign (1972) is omitted, which normalizes estimates of $\alpha_{y}$ and $\lambda_{y}$ to zero in that event year. The $\alpha_{y}$ are falsification tests that capture the relationship between the pre-vaccine average measles rates and outcomes before the vaccine was available. Their pattern and statistical significance are a direct test of of the common trends assumption. The $\lambda_{y}$ are intention-totreat effects of an additional 1 per 100,000 rate increase in the pre-vaccine measles incidence rate on the post-vaccine incidence of a disease. The estimates will equal zero if the measles vaccine affected morbidity equally across all states. If the pre-measles vaccine incidence rate is completely eliminated across states as suggested by Figure 2, the estimates will equal negative one.

Figure 4 presents the $\alpha_{y}$ and $\lambda_{y}$ estimates from Equation 2. The $\alpha_{y}$ coefficients provide evidence in support of the common trends assumption holding as there is no statistical difference for state measles rates during the pre-period. The $\lambda_{y}$ coefficients show that after the mass vaccination campaign in 1973, there is a sharp and immediate decreases in measles
incidence rates. The year estimates are negative with the majority having a coefficient of negative one, indicating a one-for-one negative impact on subsequent measles cases by prevaccine incidence rate ${ }^{30}$ This indicates that sates with higher pre-vaccine measles incidence rates experienced a greater benefit from the measles vaccine than those with lower incidence rates.

A principal concern is that the divergence in trends in measles rates across high and low incidence states is due to other factors that changed in 1973 instead of the measles vaccine. For example, the National Immunization Program could have been combined with other efforts to improve public health, such as expansions of health clinics, expansions of public health insurance, or sanitation improvements. These efforts could have been more intense in states with high measles incidence than low measles incidence. While we have not seen evidence in the reports that any of these public health investments occurred in tandem with the NIP, we conduct falsification tests to see if the program affected other diseases. If our measure captures general improvements in public health and not just the rollout of the measles vaccine we should see a similar divergence for diseases that are unrelated to measles but would be affected by improved access to health providers or clean water.

To perform falsification tests using Equation 2 we use diseases that are not a focus of the program, nor are preventable from the measles vaccine $\sqrt{31}$ We start by examining syphilis and gonorrhoea, two sexually transmitted diseases which are overwhelmingly diagnosed in adults (thus negligible incidence in the age range where measles occurs), have more than 10,000 reported cases in a year, and exhibit variation in the reported number of cases across states. If the measles vaccine was accompanied by expansion of health clinics, we would expect the incidence of these diseases should be reduced. However, as shown in the first row of Figure 5 we find coefficients that are not statistically significantly different from zero in

[^15]either the pre- or post-program period.
We next examine if there are differential changes to dysentery cases that are related to measles vaccination. Poor sanitary conditions spread dysentery as it is passed in the feces of an infected person and often spread through drinking contaminated water. Therefore, if states made investments in sanitation that coincided with the timing of the National Immunization Program and their pre-vaccine measles incidence rates, then states that benefited more from the measles vaccine would also demonstrate reductions in dysentery that corresponded to their reduction in measles incidence. The second row in Figure 5 shows no evidence of this.

We continue with the incidence rates of three other vaccine preventable infectious diseases - polio, diphtheria, and tuberculosis. The vaccines for all three were developed and had mass vaccination campaigns in Mexico well before the measles vaccine became available and the National Immunization Program was launched. Specifically, the oral polio virus vaccine became available in 1959 in Mexico and was introduced as an anti-epidemic measure with mass vaccination efforts, while a massive DPT (combined vaccine for diphtheria, pertussis, tetanus) vaccination program was instituted in 1960.32 Meanwhile the tuberculous' BCG vaccine began being produced in Mexico in 1931. These vaccines therefore predate that of the measles by at least 10 years. Therefore previous mass vaccination campaigns and availability of these other vaccines in Mexico meant that these diseases exhibited low incidence at the start of the National Immunization Program and ensured children continued to receive these vaccinations on the regular schedule. As shown in the second and third rows of Figure 5 none of these three diseases indicate a change in incidence that is related to the National Immunization Program and a state's pre-campaign measles incidence rate. This coupled with the fact none of these diseases are culprits to suffer from measles related "immune amnesia" provides additional support for access to the measles vaccine as the driver for improved childhood health.

[^16]Finally, we use the Anuario Estadístico de los Estados Unidos Mexicanos to test for changes in adult mortality from causes that are unrelated to infectious diseases but that could be affected by general improvements in public health. If the National Immunization Program only targets children for vaccinations then we do not expect to see impacts on adult health outcomes at the same time. We do this for this mortality from childbirth and mortality from accidents, poisoning and homicides. ${ }^{33}$ As shown in Figure 6 there is no significant change in trend in mortality from either cause following the launch of the NIP.

In sum, the eight event studies on diseases and adult mortality that should not be affected by the measles vaccine indicate the health affects for children from the National Immunization Program are coming through the measles vaccination channel and not through other public investments in health. We address pre-trends in the outcome variables in Section 6.

## 5 Results

### 5.1 Education

We start by examining the impact of the measles vaccine on the educational attainment of men age 18 to 65. The results are presented in Table 4. The data set used in the regressions appear in the top row of the table. The table also includes the years of the data available for analysis from each source, the age of the first fully exposed cohort in those years (those born in 1973), the number of observations, and the outcome mean. To interpret the coefficients we calculate the impact for someone with full exposure (16 years) to the vaccination program and who was born in a state with the average 8-year pre-vaccine measles incidence rate (1.33 per 1000).

Panel A of Table 4 presents results for changes in the number of years of education, which show a positive increase attributable to access to the measles vaccine. The average impact of the the estimates is consistent across all data sets, with the increase in years of schooling ranging from 0.57 years for the 2000 Census, 0.65 years for the ENE, 0.67 for the ENEU,

[^17]0.70 for the ENOE and and 0.8 years in the 1995 Conteo. These represent increases between 6.7 to 9.7 percent from the mean years of schooling in each data set.

The increase in years of education are non-trivial, and might be sufficient to push individuals into higher levels of educational attainment. These results of these estimations are shown in Table 4, and include primary education or less (Panel B), lower secondary education (Panel C), and upper secondary education or more (Panel D). Given that mean years of education range between eight and eleven, we expect to see the largest gains in the attainment of lower (9 years) and upper secondary (12 years) school.

The results confirm this expectation, showing the measles vaccine leads to a shift out of primary education or less and a shift into lower and upper secondary education. Specifically, those born in states with higher pre-vaccine incidence rates and with exposure to the measles vaccine are 5-7 percentage points less likely to have attained a primary education or less, 1.4 to 3.1 percentage points more likely to have attained a lower secondary education and 2.4-5 percentage points more likely to have attained an upper secondary education. For primary education this represents a 21 to 32 percent decline relative to the mean, while for lower and upper secondary this represents increases between 8 and 15 percent of the mean ${ }^{34}$ Thus we find fairly large changes in education attainment among the most exposed cohorts.

The educational impacts for men we find are striking because the literature has found minimal effects on men of the eradication of other diseases. Bleakely (2007) finds the hookworm eradication campaigns in the American South showed a positive impact on earnings but no statistically significant impact on educational attainment. There is substantial evidence that malaria eradication campaigns have impacts on income and household consumption but no evidence of impact on educational attainment for men across multiple settings, including the U.S., Mexico, Brazil, Columbia, and India (Bleakley 2010; Cutler et al. 2010;

[^18]Venkataramani 2012). ${ }^{35}{ }^{36}$ Our findings of increased educational attainment are plausible because measles is distinct from malaria and hookworm in that it is a universal childhood disease and your location does not determine whether or not you are exposed to (and will contract) measles during childhood. This makes it more likely that we would be able to detect positive educational attainment effects. Indeed, in the U.S. Chuard et al. (2022) find a 0.85 percentage point increase in the likelihood of graduating high school. Our findings are significantly larger than this, due to the fact that infectious disease morbidity is higher in Mexico and weaker compulsory schooling laws makes it more likely that childhood sickness due to "immune amnesia" would lead individuals to drop out of school.

### 5.2 Labor Market Outcomes

The improvements in education we found above could change labor market outcomes, and thus we next examine the impact of the measles vaccine on the incidence of employment and $\log$ real wage income for men age 18 to 65 . The results are presented in Table 5, and provide strong evidence that the measles vaccination through the National Immunization Program positively impacted these outcomes. Starting with employment, as shown in Panel A, the coefficients are positive in all five datasets and statistically significant in three. For the significant coefficients the interpretation is that for the fully exposed cohort in an average pre-vaccine incidence state, employment rates increase by 2.2 percentage points in the 1995 Conteo, by 1.5 percentage points in the 2000 Census and by 2 percentage points in the ENEU. This constitutes increases of 1.7 to 2.6 percent relative to the mean.

Continuing with wages, as shown in Panel B, we find even strong results as the coefficients are positive and significant for all five datasets. The size of the effect also is larger. For the fully vaccinated cohort in an average incidence state the predicted increases in wages are 13.2 percent in the 1995 Conteo, 8.3 percent in the 2000 Census, 6.2 percent in the ENE,

[^19]4.6 percent in the ENOE and 2.1 percent in the ENEU.

Our employment and earnings estimates are of the same sign and significance as those estimated for the United States, but the size of the coefficients is much larger. Atwood (2022) finds an employment increase of 0.3 percent ( 0.3 percentage point increase with mean employment at 0.96 ) and an increase in the natural $\log$ of income of 1.7 -percent and Chuard et al. (2022) finds a 2.7 percent increase in the $\log$ of total family income. Our results of a 1.7 to 2.6-percent increase in the likelihood of employment and a 2- to 13-percent increase in income are significantly larger. This is not unexpected. Mexico has a higher infectious disease burden than the United States, so when children receive the measles vaccine and are protected from the "immune amnesia" effects of measles the measles vaccine provides a greater protective effect in a more infectious location (Mexico) than a less infectious location (United States) ${ }^{37}$ Additionally, recent work on the long-run impacts of measles vaccination in India find a 13.8 percent increase in weekly wages (Summan et al. 2022) which is in line with our income estimates.

### 5.3 Migration Abroad

Improved education and labor market outcomes may also have led to changes in migration, although the existence of two countervailing effects make it unclear which direction this might take. On the one hand, the datasets we use cover a time period when migration rates are high, and previous work by Hanson and McIntosh (2010) find that migration increased among the age cohorts we study as a result of rising cohort size and labor supply. Thus improved health from the vaccine could increase out migration. On the other hand, improved labor market outcomes in the origin country likely dampened the incentives to migrate. This argument is in line with several papers which find migration to the U.S. is inversely related to wage and employment conditions in Mexico (Lessem 2018, Orrenius and Zavodny 2005, Monras 2020).

[^20]As shown in Panel A of Table 6, when we look at migration rates overall, the coefficients have mixed signs and are insignificant all five datasets. However, these main results may hide a more nuanced story about the impact of the measles vaccine on outmigration. Specifically, the improvements in labor market outcomes in Mexico would reduce outmigration only if they decreased the expected return of migrating to the U.S. relative to staying in Mexico. These expectations comprise expected outcomes in Mexico, which are easier to view, and expected outcomes in the U.S, which are harder to view and depend on migration networks. While the calculation of the relative returns to migration depends on the strength of one's migration network, we do not know this for individuals in any of the datasets we use. Instead we proxy for the extent of migration networks using an index of migration intensity in an individual's municipality. Mexico's National Population Council (Consejo Nacional de Población, or CONAPO) constructed this index using the percentage of households with an out, circular and return migrant and the percentage of households that receive remittances in the year 2000 Census. We take the top $20 \%$ of municipalities, classified as high or very high migration areas. As shown in Appendix Table A3 the migration measures are two the twenty times higher in municipalities categorized as high migration areas than in those categorized as having low levels of migration $\sqrt{38 \beta 9}$

We then estimate a triple difference model, interacting the pre-vaccine measles rate and years of exposure with a binary variable for living in a high migration municipality. One complication of using municipalities is that we only have this information for the current residence, not the residence of birth. We therefore must use state and municipality of residence, instead of birth, in the model. This leads to concerns over sample selection bias, if the propensity to move abroad and internally are correlated. To gauge the extent of this we restrict Equation 3 to men that reside as adults in their state of birth (70- to 80-

[^21]percent of the analysis sample). Panel B of Table 6 shows that the estimates for migration abroad after restricting the sample are consistent with the main results. The results of the triple interaction are shown in Panel C of Table 6. Here we find that migration increased significantly, but only in high migration municipalities. This confirms that among the cohorts most affected by the vaccine, only individuals with better information about labor market conditions in the U.S. become more likely to migrate abroad.

## 6 Robustness Checks

### 6.1 Pre-Existing Trends

A key concern in any difference in difference model is the existence of pre-existing trends, in which states experienced different trajectories in educational and labor market outcomes prior to the National Immunization Program. In this case the gains we document could have occurred in the the absence of the vaccine. We check for this possibility in several ways. First, following Duflo (2001) we estimate a model that separately interacts an individuals' age in the 1973, the year when the NIP started, with pre-vaccine measles rate in the state of birth. We group all five datasets together and limit the dataset to individuals who were between the ages of zero when the NIP was launched (born in 1973, 1974 or 1975) to those who were age 22 (born in 1957 to 1951). We include 1974 and 1975 to get at least two full calendar years in which the NIP was operational. We group the last three years together, making ages 20, 21 and 22 our left out group. These individuals would have finished school and entered the labor force by time the NIP started, which means very little of their education or labor market outcomes should be affected by the vaccine.

We estimate the following, where $a$ equals an individual's age in 1973. Similar to our main model we include birth-year and state fixed effects, individual controls, and cluster the standard errors by state and year of birth.

$$
\begin{equation*}
Y_{i c s t}=\beta_{0}+\sum_{a 73=0}^{19}\left(P_{a} * M_{1965-1972}^{p r e}\right) \beta_{a}+\delta_{c}+\delta_{s}+\gamma * X_{i c s t}+\epsilon_{i c s t} \tag{3}
\end{equation*}
$$

For comparison we estimate a placebo model that uses 1956 as the hypothetical year in which the measles vaccine was launched. 1956 marks the first full control cohort, as individuals born in this year would have been 17 when the measles vaccine was launched in 1973. None of the birth cohorts in this analysis had any of their childhood covered by the vaccine, and if there are no pre-existing trends, we expect to see no differences by individuals based on their ages in 1956. If, on the other hand, there are pre-existing trends across high and low measles incidence states, these graphs should look similar to those that use the actual start date of the NIP in 1973.40

The results for our main outcomes- years of education, employment and wages- are shown in Figure 7. For each outcome we graph the $\beta_{a}$ coefficients and 90 percent confidence intervals for the model that uses the actual start year of 1973 and the model that uses the placebo year of 1956. If the salient change in 1973 is improved childhood health due to the measles vaccine, instead of just a continuation of earlier trends, we should see the highest estimates for younger age cohorts and the smallest estimates for the oldest ones. In particular, the coefficients for individuals older than age 16 should be close to zero, as none of their childhoods was covered by the vaccine. Meanwhile, in the second placebo graphs we should coefficients that are close to zero across age groups.

For years of education the results clearly conform with this pattern. The coefficients are the largest for those born in 1973 and decline steadily in age groups as shown in Figure 7. The coefficient reaches an estimate of zero around age 16, and declines below zero for ages 18 and up. Meanwhile in the placebo graph the coefficients hover around zero and are insignificant for all age groups. Appendix Figure A4 presents results for different levels of educational attainment. The figures show that the education effects for NIP affected cohorts are concentrated in completion of upper- and lower-secondary education. These results support the assumption that there were no differential trends in education across

[^22]high and low measles states prior to the roll-out of the vaccine program.
The results for log income also generally provide little evidence of a pre-trend in outcomes. The coefficients are positive and significant until around age 14, becoming insignificant after that point. Meanwhile the coefficients are insignificant at all points in the placebo graph. Finally, the results for employment are not quite as strong, as they are only positive and significant for the 0-1 age group. This suggests the employment effects are concentrated in age cohorts whose entire childhood was covered by the vaccine. Meanwhile, the placebo graph does not present a similar trend, as the coefficients are negative in many age ranges and insignificant throughout. These figures show the NIP had an impact on educational attainment and earnings for exposed cohorts and not for birth cohorts with no exposure to the program, supporting the validity of our identification strategy.

Next we test for pre-existing trends by examining whether the estimates remain consistent after allowing for cohort effects to vary regionally. Our main specification, Equation 3, assumes common trends across states in the factors affecting different birth cohorts. If states experienced differential changes during this period, such as health care quality improvements or the expansion of access to health care, this assumption may fail to hold. To test for differential trends, we allow year of birth effects to vary across regions (Stephens and Yang 2014). If the estimates remain consistent with the inclusion of Census Region by year-ofbirth fixed effects included in Equation 3, this provides support that our results are not being driven by differences between Census Regions as opposed to variation within Census Regions over time.

Table 7 shows that including region by birth year fixed effects in the model does not change our estimates, suggesting that the results form the baseline model are not driven by variation between regions rather than by changes within states over time ${ }^{41}$ The magnitude of the coefficients is slightly larger with the inclusion of the region by birth year fixed effects,

[^23]but remain within one standard deviation of our main results, indicating that we are not overestimating the impact of measles vaccination with our main model. Additionally, the consistency of our estimates occurs across all data sets we use in our analysis. These findings support our main model assumption that between-region differences are not an important source of variation need to identify the model and support of the common trends assumption being valid for our preferred main model - Equation 3 .

### 6.2 Specification Checks

In our main specification we model the potential impact of the vaccine as linear in years of access prior to age 16. For example, a person born in 1971 was two years old when the vaccine was introduced in 1973, giving them 14 potential years of access. Meanwhile, someone born in 1961 was 12 when the vaccine was introduced, giving them only 4 potential years of access. In this section we consider other ways to model potential vaccine exposure. We start by limiting the potential exposure to years of access to the vaccine prior to the age of six instead of sixteen. We stop at six because the vaccines were targeted at ages zero to five. We extend the period by one year to include when most children start primary school. The results are presented in Appendix Table A4, and show the effects of the measles vaccine are larger for the group most targeted by the program. The coefficients are approximately two times larger than with our original specification, with the largest differences seen in years of education, lower and upper secondary attainment.

Next we limit the analysis sample of cohorts included. First, we model the potential benefits of the vaccine as non-linear, limiting the analysis sample to only those with no exposure (exposure $=0$ ) or a full life time of exposure (exposure $=16$ ) to the measles vaccine. Second, we limit the range of cohorts to those born between 1948 to 1978. This truncates the sample such that there are fewer observations with the extreme values of zero or sixteen years of exposure. The results are shown in Appendix Table A5 and Appendix Table A6. In both cases the coefficients of interest exhibit the same patterns when compared to our
main results. These findings show our findings do not depend on modeling exposure to the vaccine in one, particular way.

We next limit the sample to men in urban areas, since the vaccine rollout began by targeting urban areas, making the initial waves of the program more intense than in rural areas (de Castro 1983). We anticipate larger estimated effects of the vaccine among the urban sample. This expectation is confirmed in Appendix Table A7, which shows slightly larger coefficients for most outcomes in the urban sub-sample than the complete one.

Finally we comment on concerns related to Progresa and Seguro Popular, two large scale and well known government programs that provided conditional cash transfers and health insurance, respectively, to poor households. A large literature shows these programs had positive impacts on education and health outcomes, but they were implemented in 1997 (Progresa) and 2003 (Seguro Popular), which are 24 to 30 years after the NIP. Since the datasets we use cover adults age 18 to 65 in the years 1994 to 2008, the labor force, education and migration decisions of very few people in our sample should be affected by these programs.

## 7 Conclusion

We find that mass measles vaccination in Mexico led to improved long-run educational and labor market outcomes for adult men. The National Immunization Program in 1973 is a plausibly exogenous introduction of mass measles vaccination in Mexico. Being a universal childhood disease, individuals are only able to avoid contracting the measles through herd immunity, which is achieved through mass vaccination. Not contracting measles improves childhood health because children no longer experience "immune amnesia" caused by measles.

The measles vaccine has been hailed as one of the most influential public health interventions of all time. After more than 50 years since the original measles vaccine licensing in 1963 (in the United States) it has shown time and time again that it is a successful and cost
effective means of improving public health. The vast majority of the impact of the measles vaccine research focuses on short term outcomes focusing on primary measles reduction. There is a growing body of work in economics, public health, and medicine examining the positive spillover effects of the measles vaccine and its long run outcomes. We add to this literature by documenting that the measles vaccine improved long-run labor market outcomes for Mexicans, and provide additional evidence that these long-run outcomes are greater for countries with higher infectious disease burdens.

Measles is highly contagious with a $R_{0}$ of 16-18. ${ }^{42}$ To put this in context chicken pox has a $R_{0}$ of 10-12, and $R_{0}$ s for COVID variants range from 2.5 in the original strain, to 7 in delta, and omicron having a $R_{0}$ of 10 . Given measles high reproduction rate, high vaccination rates are needed to protect from community spread. To achieve herd immunity for measles 95 -percent of the population needs to be vaccinated. During the global COVID pandemic the world has witnessed the largest increase in unvaccinated children in the past two decades, threatening the progress made towards measles eradication. ${ }^{43} 19$ countries measles vaccination campaigns are still on hold from the start of the pandemic as of April 2022, putting more than 73 million children at risk for measles. Measles cases have also significantly increased with 21 large disruptive measles outbreaks in the past year as well as a 79 percent increase in reported measles cases globally from January and February 2022 compared to January and February 2021 (UNICEF 2022). Considering the magnitude of the gains in adult earnings and that these impacts are greater for those in higher infectious disease environments, there is a case to be made to to support efforts that offset/catch up measles vaccination for children that missed out due to the COVID pandemic.

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## Tables

Table 1: Summary Statistics

|  | Dataset |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |
| Age | 34.81 | 35.05 | 35.59 | 34.55 | 36.32 |
|  | $(12.69)$ | $(12.58)$ | $(12.74)$ | $(12.30)$ | $(12.84)$ |
| Years Vaccine Exposure | 6.82 | 8.82 | 9.22 | 8.54 | 10.41 |
|  | $(6.58)$ | $(6.80)$ | $(6.82)$ | $(6.77)$ | $(6.60)$ |
| Employed | 0.86 | 0.84 | 0.86 | 0.85 | 0.86 |
|  | $(0.35)$ | $(0.36)$ | $(0.35)$ | $(0.36)$ | $(0.35)$ |
| Income (2004 pesos) | 3.64 | 4.67 | 5.76 | 23.93 | 6.07 |
|  | $(7.51)$ | $(25.15)$ | $(7.81)$ | $(87.73)$ | $(7.92)$ |
| Migrates abroad | 0.04 | 0.04 | 0.02 | 0.01 | 0.01 |
|  | $(0.20)$ | $(0.20)$ | $(0.14)$ | $(0.09)$ | $(0.12)$ |
| Years of education | 8.21 | 8.25 | 8.97 | 10.09 | 8.97 |
|  | $(4.44)$ | $(4.76)$ | $(4.10)$ | $(4.10)$ | $(4.62)$ |
| Educational Attainment |  |  |  |  |  |
| Primary or below | 0.54 | 0.48 | 0.44 | 0.33 | 0.40 |
|  | $(0.50)$ | $(0.50)$ | $(0.50)$ | $(0.47)$ | $(0.49)$ |
| Lower secondary | 0.22 | 0.22 | 0.25 | 0.26 | 0.31 |
|  | $(0.41)$ | $(0.41)$ | $(0.43)$ | $(0.44)$ | $(0.46)$ |
| Upper secondary or more | 0.25 | 0.30 | 0.30 | 0.41 | 0.29 |
|  | $(0.43)$ | $(0.46)$ | $(0.46)$ | $(0.49)$ | $(0.46)$ |
| Observations | 87,755 | $2,664,170$ | 819,822 | $1,230,411$ | 530,219 |
| Years | 1995 | 2000 | $2000-2004$ | $1994-2004$ | $2005-2009$ |

Note: Sample limited to men age 18 to 65. Population weights are used.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México

Table 2: Pre 1973 Measles Rates and State Geographic Measures

|  | In Capital City, 1970 |  |  |
| :--- | :---: | :---: | :---: |
|  | (1) | $(2)$ | $(3)$ |
|  | Average | Days of |  |
| Temperature | Rain | Total <br> Precipitation <br> (milimeters) |  |
| Measles Rate 1965-1972 |  |  |  |
| Average 8 yr Measles Rate | 0.0140 | 0.0052 | 0.0065 |
|  | $(0.0117)$ | $(0.1031)$ | $(1.3437)$ |
| Observations | 32 | 32 | 32 |
| R2 | 0.05 | 0.00 | 0.00 |
| Mean Outcome | 20.49 | 72.50 | 762.30 |

* p < 0.1, ${ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1970 Statistical Annual and Salud Pública de México
Table 3: Pre 1973 Measles Rates and 1970 State Averages

|  | 1970 Census Values |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | Average | Monthly | Literacy | Employ- | ment |
| Income (Pesos) | Rate | Fertity <br> Rate | Rate | Calendar |  |
|  |  |  |  | B |  |
| Measles Rate 1965-1972 |  |  |  |  |  |
| Average 8 yr Measles Rate | -3.6207 | 0.0001 | -0.0000 | $0.0201^{*}$ | 0.0016 |
|  | $(7.5800)$ | $(0.0003)$ | $(0.0001)$ | $(0.0118)$ | $(0.0013)$ |
| Observations | 32 | 32 | 32 | 32 | 32 |
| R2 | 0.01 | 0.01 | 0.00 | 0.09 | 0.05 |
| Mean Outcome | $5,107.10$ | 0.72 | 0.49 | 45.96 | 0.56 |

* p < 0.1, ${ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1970 Census, Mexican 1970 Statistical Annual, and Salud Pública de México
Note: Fertility rates are averages for 1969 to 1971.

Table 4: Education: Years and Level Attained

|  | Dataset |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |
| PANEL A: Years |  |  |  |  |  |
| Measles Rate*Exposure | $0.03758^{* * *}$ | $0.02665^{* * *}$ | $0.03062^{* * *}$ | $0.03140^{* * *}$ | $0.03284^{* * *}$ |
|  | $(0.00688)$ | $(0.00382)$ | $(0.00391)$ | $(0.00291)$ | $(0.00446)$ |
| Mean Outcome | 8.2111 | 8.2493 | 8.9663 | 10.0918 | 8.9744 |
| PANEL B:<= Primary |  |  |  |  |  |
| Measles Rate*Exposure | $-0.00296^{* * *}$ | $-0.00234^{* * *}$ | $-0.00305^{* * *}-0.00299^{* * *}-0.00336^{* * *}$ |  |  |
|  | $(0.00061)$ | $(0.00025)$ | $(0.00035)$ | $(0.00028)$ | $(0.00036)$ |
| Mean Outcome | 0.5371 | 0.4820 | 0.4422 | 0.3311 | 0.4000 |
| PANEL C: Lower Sec. |  |  |  |  |  |
| Measles Rate*Exposure | $0.00149^{* * *}$ | $0.00120^{* * *}$ | $0.00101^{* * *}$ | $0.00069^{* * *}$ | $0.00132^{* * *}$ |
| Mean Outcome | $(0.00050)$ | $(0.00015)$ | $(0.00023)$ | $(0.00020)$ | $(0.00023)$ |
| PANEL D: >= Upper Sec. | 0.2172 | 0.2158 | 0.2488 | 0.2630 | 0.3068 |
| Measles Rate*Exposure | $0.00147^{* * * *}$ | $0.00113^{* * *}$ | $0.00194^{* * *}$ | $0.00230^{* * *}$ | $0.00206^{* * *}$ |
| Observations | $(0.00054)$ | $(0.00018)$ | $(0.00027)$ | $(0.00025)$ | $(0.00031)$ |
| Mean Value Outcome | 82,358 | $2,456,028$ | 815,608 | $1,112,769$ | 527,175 |
| Years in Sample | 0.2457 | 0.302 | 0.2994 | 0.4059 | 0.2928 |
| Age 1973 Cohort | 1995 | 2000 | $2000-2004$ | $1994-2004$ | $2005-2008$ |

* $\mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65. The coefficients on years of exposure to the measles vaccine times pre-vaccine, state level rates are shown. Population weights are used and standard errors are clustered at the level of state and year of birth. Controls include marital status, urban residency status, birth-year cohort fixed effects, and state-of-birth fixed effects. For the ENE, ENEU, and ENOE survey year fixed effects also are included. In Panel A the outcome is total years of schooling, while in Panels $\mathrm{B}, \mathrm{C}$, and D the outcome is educational attainment at the level listed.

Table 5: Employment and Wages

|  | Dataset |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |
| PANEL A: Employed |  |  |  |  |  |
| Measles Rate*Exposure | $0.00106^{*}$ | $0.00068^{* *}$ | 0.00013 | $0.00095^{* * *}$ | 0.00011 |
|  | $(0.00063)$ | $(0.00030)$ | $(0.00027)$ | $(0.00026)$ | $(0.00028)$ |
| Observations | 82,808 | $2,517,138$ | 815,757 | $1,113,677$ | 527,582 |
| Mean Outcome | 0.8612 | 0.8421 | 0.8581 | 0.8511 | 0.8586 |
| PANEL B: Log Income |  |  |  |  |  |
| Measles Rate*Exposure | $0.00620^{* * *}$ | $0.00393^{* * *}$ | $0.00289^{* * *}$ | $0.00098^{*}$ | $0.00214^{* * *}$ |
| Observations | $(0.00219)$ | $(0.00060)$ | $(0.00067)$ | $(0.00053)$ | $(0.00056)$ |
| Mean Value Outcome | 59,983 | $1,704,142$ | 708,963 | 991,205 | 448,506 |
| Years in Sample | 0.70 | 1.10 | 1.40 | 2.34 | 1.48 |
| Age 1973 Cohort | 1995 | 2000 | $2000-2004$ | $1994-2004$ | $2005-2008$ |

${ }^{*} \mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65. The coefficients on years of exposure to the measles vaccine times pre-vaccine, state level rates are shown. Population weights are used and standard errors are clustered at the level of state and year of birth. Controls include marital status, urban residency status, birth-year cohort fixed effects, and state-of-birth fixed effects. For the ENE, ENEU, and ENOE survey year fixed effects also are included. In Panel A the outcome is employment and in Panel B the outcome is income.

Table 6: Migration Abroad

|  | Dataset |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |
| PANEL A: Birth State |  |  |  |  |  |
| Measles Rate*Exposure | 0.00021 | -0.00003 | 0.00005 | -0.00002 | -0.00004 |
|  | $(0.00026)$ | $(0.00015)$ | $(0.00006)$ | $(0.00003)$ | $(0.00005)$ |
| Observations | 87,399 | $2,652,986$ | 815,888 | $1,113,734$ | 527,640 |
| Mean Value Outcome | 0.0434 | 0.0413 | 0.0189 | 0.0088 | 0.0139 |
| Years in Sample | $1990-1995$ | $1995-2000$ | $2000-2004$ | $1994-2004$ | $2005-2008$ |
| PANEL B: Residence State |  |  |  |  |  |
| Measles Rate*Exposure | 0.00014 | -0.00017 | 0.00002 | -0.00003 | -0.00000 |
| Observations | $(0.00027)$ | $(0.00015)$ | $(0.00006)$ | $(0.00003)$ | $(0.00006)$ |
| Mean Value Outcome | 69,094 | $2,174,664$ | 609,463 | 794,471 | 404,854 |
| PANEL C: Municipality | 0.0562 | 0.0523 | 0.0214 | 0.0096 | 0.0159 |
| Measles Rate*Exposure | -0.00017 | $-0.00040^{* * *}$ | -0.00004 | -0.00003 | -0.00003 |
|  | $(0.00023)$ | $(0.00010)$ | $(0.00006)$ | $(0.00003)$ | $(0.00005)$ |
| Measles Rate*Exposure | $0.00971^{* * *}$ | $0.00909 * * *$ | $0.00320 * * *$ | -0.00003 | $0.00184^{* * *}$ |
| High Migration |  |  |  |  |  |
| Observations | $(0.00070)$ | $(0.00027)$ | $(0.00033)$ | $(0.00174)$ | $(0.00022)$ |
| Mean High Mig. Mun. | 69,094 | $2,174,664$ | 609,455 | 794,438 | 404,835 |
| Mean Low Mig. Mun. | 0.0380 | 0.0380 | 0.0152 | 0.0096 | 0.0127 |

${ }^{*} \mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65 . The coefficients on years of exposure to the measles vaccine times pre-vaccine, state level rates are shown. Population weights are used and standard errors are clustered at the level of state and year of birth. Controls include marital status, urban residency status, birth-year cohort fixed effects, and state-of-birth fixed effects. For the ENE, ENEU, and ENOE survey year fixed effects also are included. In all Panels the outcome is migration abroad. Panel A links individuals to their state of birth, while Panels B and C link them to their state of residence. Panel C also includes a control for being in a high migration municipality.

Table 7: Robustness: Region-Birth Year Fixed Effects

|  | Dataset |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) <br> 1995 Count | (2) <br> 2000 Census | $\begin{gathered} (3) \\ \text { ENE } \end{gathered}$ | (4) <br> ENEU | (5) ENOE |
| PANEL A: Employment Measles Rate*Exposure | $\begin{aligned} & 0.00167^{* * *} \\ & (0.00054) \end{aligned}$ | $\begin{aligned} & 0.00135^{* * *} \\ & (0.00026) \end{aligned}$ | $\begin{aligned} & 0.00081^{* * *} \\ & (0.00023) \end{aligned}$ | $\begin{gathered} { }^{*} 0.00136^{* *} \\ (0.00019) \end{gathered}$ | $\begin{aligned} & \text { * } 0.00037 \\ & (0.00025) \end{aligned}$ |
| PANEL B: Log Income Measles Rate*Exposure | $\begin{aligned} & 0.00652^{* * *} \\ & (0.00207) \end{aligned}$ | $\begin{aligned} & 0.00460^{* * *} \\ & (0.00051) \end{aligned}$ | $\begin{aligned} & 0.00260^{* * *} \\ & (0.00059) \end{aligned}$ | $\begin{aligned} & * 0.00144^{* *} \\ & (0.00046) \end{aligned}$ | $\begin{aligned} & * 0.00225^{* * *} \\ & (0.00055) \end{aligned}$ |
| PANEL C: Years Educ. <br> Measles Rate*Exposure | $\begin{aligned} & 0.04249^{* * *} \\ & (0.00641) \end{aligned}$ | $\begin{aligned} & 0.03075^{* * *} \\ & (0.00353) \end{aligned}$ | $\begin{aligned} & 0.03422^{* * *} \\ & (0.00337) \end{aligned}$ | $\begin{gathered} { }^{0} 0.03073^{* *} \\ (0.00236) \end{gathered}$ | $\begin{aligned} & * 0.03565^{* * *} \\ & (0.00424) \end{aligned}$ |
| PANEL C: $<=$ Primary Measles Rate*Exposure | $\begin{gathered} 0.00038 \\ (0.00058) \end{gathered}$ | $\begin{gathered} 0.00048^{*} \\ (0.00026) \end{gathered}$ | $\begin{aligned} & -0.00019 \\ & (0.00027) \end{aligned}$ | $\begin{aligned} & -0.00001 \\ & (0.00019) \end{aligned}$ | $\begin{aligned} & -0.00057^{*} \\ & (0.00030) \end{aligned}$ |
| PANEL E: Lower Sec. <br> Measles Rate*Exposure | $\begin{aligned} & 0.00201^{* * *} \\ & (0.00049) \end{aligned}$ | $\begin{aligned} & 0.00185^{* * *} \\ & (0.00014) \end{aligned}$ | $\begin{aligned} & 0.00180^{* * *} \\ & (0.00021) \end{aligned}$ | $\begin{aligned} & * 0.00137^{* * *} \\ & (0.00017) \end{aligned}$ | $\begin{aligned} & \text { * } 0.00186^{* * *} \\ & (0.00023) \end{aligned}$ |
| PANEL F: $>=$ Upper Sec. <br> Measles Rate*Exposure | $\begin{aligned} & 0.00169^{* * *} \\ & (0.00054) \end{aligned}$ | $\begin{aligned} & 0.00116^{* * *} \\ & (0.00017) \end{aligned}$ | $\begin{aligned} & 0.00174^{* * *} \\ & (0.00026) \end{aligned}$ | $\begin{aligned} & * 0.00184^{* * *} \\ & (0.00022) \end{aligned}$ | $\begin{aligned} & * 0.00207^{* * *} \\ & (0.00030) \end{aligned}$ |
| PANEL G: Migration <br> Measles Rate*Exposure | $\begin{gathered} 0.00045^{*} \\ (0.00025) \end{gathered}$ | $\begin{gathered} 0.00014 \\ (0.00016) \end{gathered}$ | $\begin{aligned} & -0.00001 \\ & (0.00006) \end{aligned}$ | $\begin{aligned} & -0.00005^{*} \\ & (0.00003) \end{aligned}$ | $\begin{aligned} & -0.00007 \\ & (0.00005) \end{aligned}$ |

${ }^{*} \mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65. The coefficients on years of exposure to the measles vaccine times pre-vaccine, state level measures rates are shown. Population weights are used and standard errors are clustered at the level of state and year of birth. Controls include marital status, urban residency status, birth-year cohort fixed effects, and state-of-birth fixed effects and add region by birth-year fixed effects. For the ENE, ENEU, and ENOE survey year fixed effects also are included.

## Figures

Figure 1: National Incidence of Measles Morbidity and Mortality


Notes: Data come from the annual epidemiology bulletins published in and Salud Pública de México. The solid line shows the national measles incidence rate by year and the dashed line shows the number of measles deaths in the nation by year. The vertical line denotes 1973, the year Mexico launched its National Immunization Program. There is a sharp reduction in both measles morbidity and mortality that corresponds to the National Immunization Program. Mortality data is only available from 1965 to 1975 in the reports. A worldwide measles epidemic occurs in 1976, which accounts for the increase in cases in 1976 and 1977.

Figure 2: National Incidence of Infectious Disease in Mexico


Source: Salud Pública de México - publishing of annual epidemiology bulletins.

Figure 3: Map of Pre-Vaccine Incidence Rates in Mexico

Annual Incidence from 1965-1972


Source: Salud Pública de México - publishing of annual epidemiology bulletins.

Figure 4: Event Study Figures of Measles in Mexico

Panel A: Measles 1967-1978


Notes: The figure shows regression adjusted estimates of the National Immunization Program's intention-to-treat effect on measles. The dependent variable is the incidence rate per 100,000 population for a state in a year. The solid line plots the estimated coefficients from Equation 2 on interactions between the time to vaccination program dummies and the average eight-year pre-program measles incidence rate. The year prior to the program is omitted. The model includes state fixed effects and controls for the state population. The dashed lines are point-wise 95 -percent confidence intervals based on standard errors clustered at the state level. The data come from the annual epidemiology bulletins published in and Salud Pública de México.

Figure 5: Event Study Figures of Infectious Disease in Mexico 1967-1978

## Syphilis



Dysentery


Diptheria


## Gonorrhea



Tuberculosis


Polio


Note: The figure shows regression adjusted estimates of the National Immunization Program's intention-totreat effect on disease incidence. The dependent variable is the incidence rate per 100,000 population for a state in a year. The solid line plots the estimated coefficients from Equation 2 on interactions between the time to vaccination program dummies and the average eight-year pre-program measles incidence rate. The year prior to the program is omitted. The model includes state fixed effects and controls for the state population. The dashed lines are point-wise 95 -percent confidence intervals based on standard errors clustered at the state level.
Source: Salud Pública de México.

Figure 6: Event Study Figures of Other Cause Mortality 1967-1978

Maternal


Accidents/Homicides


Note: The figure shows regression adjusted estimates of the National Immunization Program's intention-totreat effect on mortality from maternity or accidents/poisoning/homicides. The dependent variable is the incidence rate per 100,000 population for a state in a year. The solid line plots the estimated coefficients from Equation 2 on interactions between the time to vaccination program dummies and the average eight-year pre-program measles incidence rate. The year prior to the program is omitted. The model includes state fixed effects and controls for the state population. The dashed lines are point-wise 95 -percent confidence intervals based on standard errors clustered at the state level.
Source: Salud Pública de México and Anuario Estadístico, multiple years

Figure 7: Pre-Trend Checks: Age Interactions


Note: The figure shows coefficients on age in 1973 or 1956 interacted with pre-vaccine measles rates in the state of birth. The left out group is individuals who were age 21 in the given year. The model includes state and birth-year cohort fixed effects. The dashed lines are point-wise 90 -percent confidence intervals based on standard errors clustered at the state and year of birth.
Source: Salud Pública de México.

## Appendix

Table A1: Pre Vaccine Measles Rates, State Ranking
$\left.\begin{array}{lcccc}\hline \hline & \begin{array}{c}\text { Average 8 year } \\ \text { Measles Rate } \\ \text { (per 100,000) }\end{array} & \begin{array}{c}\text { Average Income } \\ \text { (pesos) }\end{array} & \begin{array}{c}\text { Population } \\ \text { (Thousands) }\end{array} & \begin{array}{c}\text { School } \\ \text { Calendar }\end{array} \\ \text { B }\end{array}\right]$

Source: Salud Pública de México and 1970 Mexican Census.

Table A2: Robustness: Less than Primary and Primary Education

|  | Dataset |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |
| PANEL A: < Primary |  |  |  |  |  |
| Measles Rate*Exposure | $-0.00389^{* * *}$ | $-0.00297^{* * *}$ | $-0.00289^{* * *}$ | $-0.00293^{* * *}$ | $-0.00303^{* * *}$ |
|  | $(0.00066)$ | $(0.00039)$ | $(0.00044)$ | $(0.00030)$ | $(0.00044)$ |
| Mean Outcome | 0.2882 | 0.2435 | 0.2089 | 0.1146 | 0.1794 |
| PANEL B: Primary |  |  |  |  |  |
| Measles Rate*Exposure | 0.00093 | $0.00064^{* *}$ | -0.00016 | -0.00007 | -0.00034 |
|  | $(0.00060)$ | $(0.00026)$ | $(0.00030)$ | $(0.00019)$ | $(0.00031)$ |
| Mean Outcome | 0.2489 | 0.2385 | 0.2333 | 0.2165 | 0.2206 |

${ }^{*} \mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65. Population weights are used and standard errors are clustered at the level of year and state of birth.

Table A3: Summary Statistics, Migration Intensity

|  | $(1)$ | $(2)$ | $(3)$ |
| :--- | :---: | :---: | :---: |
| Variable | Low Migration | High Migration | Difference |
| \% HHs receive remittances | 3.470 | 18.637 | $15.167^{* * *}$ |
|  | $(3.655)$ | $(7.620)$ | $(0.238)$ |
| \% HHs with an out migrant | 3.702 | 16.811 | $13.108^{* * *}$ |
|  | $(3.873)$ | $(5.996)$ | $(0.221)$ |
| \% HHs with a circular migrant | 0.573 | 3.776 | $3.203^{* * *}$ |
|  | $(0.823)$ | $(3.460)$ | $(0.087)$ |
| \% HHs with a return migrant | 0.509 | 3.764 | $3.255^{* * *}$ |
|  | $(0.729)$ | $(2.229)$ | $(0.060)$ |
| Migration intensity index | -0.382 | 1.681 | $2.063^{* * *}$ |
|  | $(0.436)$ | $(0.813)$ | $(0.027)$ |
| Observations | 1,951 | 492 | 2,443 |

Note: Means by municipality, using the year 2000 Mexican Census. High migration municipalities are those categorized as having intensity of high or very high (top $20 \%$ ). Low migration municipalities are all others. Source: CONAPO.

Table A4: Robustness: Years of Exposure Capped at 6

|  | Dataset |  |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) | $(2)$ | $(3)$ | $(4)$ | $(5)$ |  |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |  |
| PANEL A: Employment |  |  |  |  |  |  |
| Measles Rate*Exposure | 0.00238 | $0.00202^{* *}$ | 0.00087 | $0.00296^{* * *}$ | 0.00052 |  |
|  | $(0.00198)$ | $(0.00086)$ | $(0.00071)$ | $(0.00071)$ | $(0.00070)$ |  |
| PANEL B: Log Income |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.0102^{*}$ | $0.00864^{* * *}$ | $0.00561^{* * *}$ | 0.00166 | $0.00318^{* *}$ |  |
|  | $(0.00598)$ | $(0.00155)$ | $(0.00159)$ | $(0.00128)$ | $(0.00125)$ |  |
| PANEL C: Yrs. Educ. |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.07785^{* * *}$ | $0.05798^{* * *}$ | $0.06363^{* * *}$ | $0.06378^{* * *}$ | $0.06840^{* * *}$ |  |
|  | $(0.01815)$ | $(0.00954)$ | $(0.00903)$ | $(0.00683)$ | $(0.00971)$ |  |
| PANEL D: <= Primary |  |  |  |  |  |  |
| Measles Rate*Exposure | 0.00099 | $0.00111^{*}$ | -0.00066 | -0.00040 | -0.00103 |  |
|  | $(0.00155)$ | $(0.00060)$ | $(0.00065)$ | $(0.00044)$ | $(0.00063)$ |  |
| PANEL E: Lower Sec. |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.00291^{* *}$ | $0.00309^{* * *}$ | $0.00209^{* * *}$ | $0.00170^{* * *}$ | $0.00260^{* * *}$ |  |
|  | $(0.00142)$ | $(0.00036)$ | $(0.00058)$ | $(0.00051)$ | $(0.00054)$ |  |
| PANEL F: >= Upper Sec. |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.00363^{* *}$ | $0.00221^{* * *}$ | $0.00399^{* * *}$ | $0.00457^{* * *}$ | $0.00454^{* * *}$ |  |
|  | $(0.00150)$ | $(0.00047)$ | $(0.00067)$ | $(0.00061)$ | $(0.00073)$ |  |

* $\mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65 . Population weights are used and standard errors are clustered at the level of year and state of birth.

Table A5: Robustness: Full or Zero Exposure to Measles Vaccine

|  | Dataset |  |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) | $(2)$ | $(3)$ | $(4)$ | $(5)$ |  |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |  |
| PANEL A: Employment |  |  |  |  |  |  |
| Measles Rate*Exposure | 0.00091 | $0.00066^{* *}$ | 0.00008 | $0.00093^{* * *}$ | 0.00007 |  |
|  | $(0.00081)$ | $(0.00031)$ | $(0.00028)$ | $(0.00028)$ | $(0.00030)$ |  |
| PANEL B: Log Income |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.00647^{* *}$ | $0.00460^{* * *}$ | $0.00304^{* * *}$ | $0.00120^{* *}$ | $0.00262^{* * *}$ |  |
|  | $(0.00275)$ | $(0.00069)$ | $(0.00078)$ | $(0.00061)$ | $(0.00067)$ |  |
| PANEL C: Yrs. Educ. |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.03882^{* * *}$ | $0.02898^{* * *}$ | $0.03424^{* * *}$ | $0.03429^{* * *}$ | $0.03498^{* * *}$ |  |
|  | $(0.00914)$ | $(0.00437)$ | $(0.00455)$ | $(0.00337)$ | $(0.00540)$ |  |
| PANEL D: <= Primary | 0.00100 | $0.00057^{*}$ | -0.00012 | -0.00000 | -0.00029 |  |
| Measles Rate*Exposure | $(0.00079)$ | $(0.00030)$ | $(0.00033)$ | $(0.00022)$ | $(0.00036)$ |  |
| PANEL E: Lower Sec. |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.00099^{*}$ | $0.00116^{* * *}$ | $0.00108^{* * *}$ | $0.00055^{* *}$ | $0.00135^{* * *}$ |  |
|  | $(0.00058)$ | $(0.00016)$ | $(0.00025)$ | $(0.00022)$ | $(0.00025)$ |  |
| PANEL F: >= Upper Sec. |  |  |  |  |  |  |
| Measles Rate*Exposure | $0.00187^{* * *}$ | $0.00135^{* * *}$ | $0.00214^{* * *}$ | $0.00259^{* * *}$ | $0.00211^{* * *}$ |  |
|  | $(0.00069)$ | $(0.00019)$ | $(0.00030)$ | $(0.00028)$ | $(0.00035)$ |  |

* $\mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65 born either before 1957 (0 years exposure) or after 1973 (16 years of exposure). Population weights are used and standard errors are clustered at the level of year and state of birth.

Table A6: Robustness: 1948 to 1978 Birth Cohorts Only

|  | Dataset |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) <br> 1995 Count | (2) <br> 2000 Census | $\begin{aligned} & (3) \\ & \text { ENE } \end{aligned}$ | (4) <br> ENEU | (5) <br> ENOE |
| PANEL A: Employment Measles Rate*Exposure | $\begin{gathered} 0.00095 \\ (0.00069) \end{gathered}$ | $\begin{aligned} & 0.00048^{* *} \\ & (0.00021) \end{aligned}$ | $\begin{gathered} 0.00009 \\ (0.00022) \end{gathered}$ | $\begin{aligned} & 0.00112^{* * *} \\ & (0.00028) \end{aligned}$ | $\begin{aligned} & -0.00005 \\ & (0.00017) \end{aligned}$ |
| PANEL B: Log Income Measles Rate*Exposure | $\begin{gathered} 0.00488^{* *} \\ (0.00238) \end{gathered}$ | $\begin{aligned} & 0.00332^{* * *} \\ & (0.00063) \end{aligned}$ | $\begin{aligned} & 0.00248^{* * *} \\ & (0.00067) \end{aligned}$ | $\begin{gathered} 0.00047 \\ (0.00061) \end{gathered}$ | $\begin{aligned} & 0.00202^{* * *} \\ & (0.00055) \end{aligned}$ |
| PANEL C: Yrs. Educ. <br> Measles Rate*Exposure | $\begin{aligned} & 0.03568^{* * *} \\ & (0.00786) \end{aligned}$ | $\begin{aligned} & 0.02454^{* * *} \\ & (0.00397) \end{aligned}$ | $\begin{aligned} & 0.02294^{* * *} \\ & (0.00406) \end{aligned}$ | $\begin{aligned} & 0.02651^{* * *} \\ & (0.00315) \end{aligned}$ | $\begin{aligned} & 0.02818^{* * *} \\ & (0.00441) \end{aligned}$ |
| PANEL D: <= Primary <br> Measles Rate*Exposure | $\begin{gathered} 0.00012 \\ (0.00067) \end{gathered}$ | $\begin{aligned} & 0.00081^{* * *} \\ & (0.00030) \end{aligned}$ | $\begin{aligned} & -0.00001 \\ & (0.00036) \end{aligned}$ | $\begin{aligned} & -0.00023 \\ & (0.00022) \end{aligned}$ | $\begin{gathered} 0.00015 \\ (0.00038) \end{gathered}$ |
| PANEL E: Lower Sec. <br> Measles Rate*Exposure | $\begin{aligned} & 0.00147^{* *} \\ & (0.00059) \end{aligned}$ | $\begin{aligned} & 0.00103^{* * *} \\ & (0.00017) \end{aligned}$ | $\begin{aligned} & 0.00104^{* * *} \\ & (0.00031) \end{aligned}$ | $\begin{gathered} 0.00062^{* *} \\ (0.00025) \end{gathered}$ | $\begin{aligned} & 0.00141^{* * *} \\ & (0.00031) \end{aligned}$ |
| PANEL F: >= Upper Sec. Measles Rate*Exposure | $\begin{gathered} 0.00163^{* *} \\ (0.00063) \end{gathered}$ | $\begin{aligned} & 0.00099^{* * *} \\ & (0.00019) \end{aligned}$ | $\begin{aligned} & 0.00130^{* * *} \\ & (0.00030) \end{aligned}$ | $\begin{aligned} & 0.00196^{* * *} \\ & (0.00029) \end{aligned}$ | $\begin{aligned} & 0.00211^{* * *} \\ & (0.00035) \end{aligned}$ |

* $\mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65 born between 1948 and 1978. Population weights are used and standard errors are clustered at the level of year and state of birth.

Table A7: Robustness: Urban Only Sample


Table A8: Robustness: Employment Alternate Pre-Period Years

|  | Pre Period Years |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | (1) 4 Years | (2) <br> 5 Years | (3) 6 Years | (4) 7 Years |
| PANEL A: Conteo 1995 Measles Rate*Exposure | $\begin{gathered} 0.00122^{*} \\ (0.00066) \end{gathered}$ | $\begin{gathered} 0.00144^{* *} \\ (0.00069) \end{gathered}$ | $\begin{gathered} 0.00138^{*} \\ (0.00072) \end{gathered}$ | $\begin{gathered} 0.00110^{*} \\ (0.00060) \end{gathered}$ |
| PANEL B: Census 2000 Measles Rate*Exposure | $\begin{aligned} & 0.00091^{* * *} \\ & (0.00032) \end{aligned}$ | $\begin{aligned} & 0.00103^{* * *} \\ & (0.00035) \end{aligned}$ | $\begin{aligned} & 0.00101^{* * *} \\ & (0.00036) \end{aligned}$ | $\begin{aligned} & 0.00082^{* * *} \\ & (0.00029) \end{aligned}$ |
| PANEL C: ENE <br> Measles Rate*Exposure | $\begin{gathered} 0.00054^{*} \\ (0.00028) \end{gathered}$ | $\begin{gathered} 0.00062^{* *} \\ (0.00030) \end{gathered}$ | $\begin{gathered} 0.00053^{*} \\ (0.00031) \end{gathered}$ | $\begin{gathered} 0.00039 \\ (0.00026) \end{gathered}$ |
| PANEL D: ENEU <br> Measles Rate*Exposure | $\begin{aligned} & 0.00135^{* * *} \\ & (0.00026) \end{aligned}$ | $\begin{aligned} & 0.00143^{* * *} \\ & (0.00028) \end{aligned}$ | $\begin{aligned} & 0.00137^{* * *} \\ & (0.00029) \end{aligned}$ | $\begin{aligned} & 0.00111^{* * *} \\ & (0.00025) \end{aligned}$ |
| PANEL E: ENOE <br> Measles Rate*Exposure | $\begin{gathered} 0.00028 \\ (0.00030) \end{gathered}$ | $\begin{gathered} 0.00035 \\ (0.00032) \end{gathered}$ | $\begin{gathered} 0.00028 \\ (0.00033) \end{gathered}$ | $\begin{gathered} 0.00023 \\ (0.00027) \end{gathered}$ |

${ }^{*} \mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: Sample limited to men age 18 to 65 . Population weights are used and standard errors are clustered at the level of year and state of birth.

Table A9: Robustness: Log Income Alternate Pre-Period Years

|  | Pre Period Years |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | (1) | (2) | (3) | (4) |
|  | 4 | 5 | 6 | 7 |
| PANEL A: Conteo 1995 |  |  |  |  |
| Measles Rate*Exposure | $0.00527^{* *}$ | $0.00568^{* *}$ | $0.00651^{* * *}$ | $0.00506^{* *}$ |
|  | (0.00219) | (0.00230) | (0.00237) | (0.00206) |
| PANEL B: Census 2000 |  |  |  |  |
| Measles Rate*Exposure | $0.00379^{* * *}$ | $0.00412^{* * *}$ | $0.00452^{* * *}$ | $0.00359^{* * *}$ |
|  | (0.00065) | (0.00069) | (0.00071) | (0.00059) |
| PANEL C: ENE |  |  |  |  |
| Measles Rate*Exposure | $0.00287^{* * *}$ | $0.00304^{* * *}$ | $0.00349^{* * *}$ | $0.00248^{* * *}$ |
|  | (0.00071) | (0.00075) | (0.00077) | (0.00065) |
| PANEL D: ENEU |  |  |  |  |
| Measles Rate*Exposure | 0.00070 | $0.00100^{* *}$ | $0.00098^{* *}$ | 0.00060 |
|  | (0.00046) | (0.00048) | (0.00050) | (0.00043) |
| PANEL E: ENOE |  |  |  |  |
| Measles Rate*Exposure | $0.00180^{* * *}$ | $0.00184^{* * *}$ | $0.00218^{* * *}$ | $0.00156^{* * *}$ |
|  | (0.00059) | (0.00062) | (0.00063) | (0.00054) |

${ }^{*} \mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.
Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México Note: Sample limited to men age 18 to 65 . Population weights are used and standard errors are clustered at the level of year and state of birth.

Table A10: Robustness: Outmigration

|  | Dataset |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ |
|  | 1995 Count | 2000 Census | ENE | ENEU | ENOE |
| PANEL A: Birth State |  |  |  |  |  |
| Measles Rate*Exposure | 0.00039 | 0.00011 | 0.00005 | $-0.00008^{*}$ | -0.00017 |
|  | $(0.00034)$ | $(0.00027)$ | $(0.00012)$ | $(0.00005)$ | $(0.00019)$ |
| Observations | 60,628 | $1,819,229$ | 553,156 | 785,149 | 341,574 |
| Mean Value Outcome | 0.0539 | 0.0531 | 0.0227 | 0.0100 | 0.0175 |
| Years in Sample | $1990-1995$ | $1995-2000$ | $2000-2004$ | $1994-2004$ | $2005-2008$ |
| PANEL B: Residence State |  |  |  |  |  |
| Measles Rate*Exposure | 0.00034 | -0.00009 | 0.00004 | $-0.00008^{*}$ | -0.00021 |
|  | $(0.00036)$ | $(0.00027)$ | $(0.00015)$ | $(0.00004)$ | $(0.00024)$ |
| Observations | 48,976 | $1,518,306$ | 424,596 | 578,018 | 269,148 |
| Mean Value Outcome | 0.0680 | 0.0653 | 0.0254 | 0.0108 | 0.0198 |
| PANEL C: Residence State |  |  |  |  |  |
| Measles Rate*Exposure* | -0.0000004 | -0.0000001 | $0.0000001^{* *}-0.0000000$ | 0.0000000 |  |
| Distance | $(0.00000)$ | $(0.00000)$ | $(0.00000)$ | $(0.00000)$ | $(0.00000)$ |
|  | 69,094 | $2,174,664$ | 609,455 | 794,438 | 404,835 |

* $\mathrm{p}<0.1,{ }^{* *} \mathrm{p}<0.05,{ }^{* * *} \mathrm{p}<0.01$. Standard errors in parentheses.

Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE, ENOE and Salud Pública de México
Note: In Panel A and B the sample is limited to men age 18 to 40. In Panel C the sample is limited to men age 18 to 65 . Population weights are used and standard errors are clustered at the level of year and state of birth (Panel A) or residence (Panels B and C).

Figure A1: Years of Education Distribution by Dataset


Source: Mexican 1995 Conteo, Mexican 2000 Census, ENEU, ENE.

Figure A2: Incidence, Other Diseases


Figure A3: Out Migration


ENOE 2005-2008


Figure A4: Pre-Trend Checks: Educational Attainment

Primary Ed. Age 1973


Lower Secondary Ed. Age 1973


Up.Secondary and Above Age 1973


Primary Ed. Age 1956


Lower Secondary Ed. Age 1956


Up.Secondary and Above Age 1956


Note: The figure shows coefficients on age in 1973 or 1956 interacted with pre-vaccine measles rates in the state of birth. The left out group is individuals who were age 20 and 21 in the given year. The model includes state and birth-year cohort fixed effects. The dashed lines are point-wise 90 -percent confidence intervals based on standard errors clustered at the birth-year and state of birth level. Source: Salud Pública de México.


[^0]:    *We thank Cynthia Bansak, Carole Gresenz, Michael Richards, Sebastian Tello-Trillo, and participants in the NBER Summer Institute, Williams Economics Department seminar series, Global Labor Organization (GLO), Vassar Economics Brownbag, the LAC Labor and Public Conference, NDIRA Data-Intensive Research Conference, Southeastern Health Economics Study Group Meeting (SHESG), and LACEA for comments. We also thank Christopher Woodruff for providing the historic data on distance to train stations and the U.S. border via train.
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[^1]:    ${ }^{1}$ This strategy is similar to that used in studies on the impact of hookworm, malaria, and measles eradication (Bleakley 2007; 2010; Cutler et al. 2010; Lucas 2010; Atwood 2022; Venkataramani 2012).

[^2]:    ${ }^{2}$ Compulsory (lower secondary) schooling was raised from six (primary) to nine years in 1992. It was not raised to upper secondary school until 2012. Source: (Merrill and Miró, 1996)

[^3]:    ${ }^{3}$ For example: S. R. Bhalotra and Venkataramani 2013; Case, Fertig, and Paxson 2005; Case and Paxson 2009; Almond 2006; Currie and Moretti 2007; Bleakley 2007; 2010b; 2010a; Cutler et al. 2010; Lucas 2010; Venkataramani 2012; S. Bhalotra and Venkataramani 2015; Almond and Currie 2011a; 2011b; Atwood 2022.

[^4]:    ${ }^{4}$ https://www.cdc.gov/measles/hcp/index.html

[^5]:    ${ }^{5}$ For a comprehensive discussion of "immune amnesia" see Atwood 2022.

[^6]:    ${ }^{6}$ The measles vaccine was first licensed in the United States in 1963, and was available on the market. Vaccination rates were extremely low in Mexico prior to the National Immunization Program. But with the availability of a vaccine and the high uptake of it in other countries like the United States there were fewer measles cases in the world after the vaccine was licensed.
    ${ }^{7}$ The national level measles incidence rate is 94.8 per 100,000 population, from 1967-1972, and the death rate is 18.5 per 100,000 population. Both of these measures decrease in the subsequent period, 1973-1981, with measles incidence rate dropping to 26.2 per 100,000 population and the death rate to 4 per 100,000 population (de Castro 1983). The drop is attributable to extensive vaccine use, which occurred because of the National Immunization Program that started in 1973 (Bravo and Diaz 1980; de Castro 1983; Santos 2004).
    ${ }^{8}$ The program followed the recommendations of the World Health Organization and included four vaccines for children ages 0 to 5 ; measles, polio, tuberculosis, and diphtheria, pertussis and tetanus (DTP). However, as we discuss in section 4.2, the measles vaccine is the only new one, as the vaccines for polio, tuberculosis and DTP were in production and circulation since the 1950s and 1960s in Mexico. The low incidence and mortality rates for these diseases suggest vaccine uptake was high prior to 1973 . Further, any observed reductions pale in comparison to measles. So while the NIP was not a measles only program, measles was the disease that, by far, was most affected by it.
    ${ }^{9}$ The National Immunization Program is a federal program that did not allow for state variation in strategy in how the program was implemented. Additionally, the program did not coincide with changes to the health system. Mexico's centralized health service system originated in 1943 with the establishment of the SSA (defines policies emanating from the federal department and provides health services to individuals without social security), IMSS (provides health services and social security to the private sector), and Mexican Children's Hospital (provides highly specialize services and conducts research). The ISSSTE was established in 1960 and is similar to the the IMSS but covers public sector workers (Castro 2014).

[^7]:    ${ }^{10}$ An important feature of the rollout campaign is variation in the intensity by urban and rural areas. Until 1985 only communities with greater than 1500 people were programmed for routine immunization activities (Santos 2004). There are a great number of small villages with scattered population making it challenging for vaccination brigades to cover them all (de Castro 1983). For this reason we include urban/rural status as a control in the regressions.
    ${ }^{11}$ Prior to the introduction of mass measles vaccination campaigns in a country measles case count reporting is low around the world. In Mexico there is massive under reporting with academic papers estimating that only 3 -percent of measles cases are actually reported. This is in line with under-reporting figures from the United States and Italy. Post immunization campaign reporting improves to 20-percent. Mortality is more accurately reported (de Castro 1983).
    ${ }^{12}$ In 1976 there was a worldwide measles epidemic which is indicated in the increase of measles cases.
    ${ }^{13}$ While measles mortality drops significantly post launch of the National Immunization Program it is unlikely to have a significant impact the composition of those that reach adulthood. Prior to 1973 about 8,000 measles deaths a year occurred, after mass immunization started the number of deaths drops to fewer than 500 a year nationally.

[^8]:    ${ }^{14}$ In 1965 Mexico introduced the Pan American Health Organization (PAHO) reporting format for the surveillance of transmissible diseases (Santos 2004). Disease incidence data is less well measured than disease mortality data. This is particularly true for measles reporting across the world and in Mexico. For example, mortality data by state and disease is available only for a select number of years (1971-1974). However, there is no evidence that measles incidence reporting changes within states over time during the pre-vaccination period. Therefore by including both state-fixed effects and year-fixed effects in our empirical models we are able to control for under reporting of measles in the pre-period and its variation across states.

[^9]:    ${ }^{15}$ The data and documentation for these datasets are publicly available on the website of the Instituto Nacional de Estadística, Geografía e Informática (INEGI): www.inegi.gob.mx. We cannot use the 2005 Intercensal count, as it does not include state of birth
    ${ }^{16}$ For income we use the highest value over the time they are in the panel.
    ${ }^{17}$ To ensure no double counting of international migrants we only count those who appear in the separate migration module. We do not use the migration questions that appear in the main questionnaire.

[^10]:    ${ }^{18}$ Researchers have shown that the migration flows in the ENOE match those from other representative datasets in Mexico, including the ENADID and the EMIF (Conover et al. 2022). Meanwhile other datasets used to examine migration in Mexico, principally the Mexican Family Life Survey and the Mexican Migration Project, are not representative at the state level nor are they very large. They do not have sufficient geographic and age cohort variation to capture the effect of the measles vaccination program.
    ${ }^{19}$ In the appendix we also consider less than primary ( $0-5$ years) and primary ( 6 to 8 years of education) separately. For the datasets that do not have a code for educational attainment we follow INEGI and code this based on the highest level of schooling one reaches plus the years completed at that level. For example, someone who reached lower secondary school but only completed one year would not have finished this level of schooling. They are coded as having completed just a primary education. More details are available upon request.

[^11]:    ${ }^{20} \mathrm{~A}$ standard difference-in-differences model assumes that the measles vaccine is limited to the year of birth. This is not the case because individuals can contract measles throughout childhood. Therefore our preferred specification allows for differential exposure to the measles vaccine.
    ${ }^{21}$ Appendix Tables A9 and A8 present the estimates for Equation 3 using different numbers of years in $M^{p r e}$ for employment and log income.

[^12]:    ${ }^{22}$ Matching this way can be important when examining later life outcomes, since migration within country is more likely over the long term. In the Appendix we will present regressions using state of residence as an adult.
    ${ }^{23}$ We use a maximum of 16 years of exposure as measles incidence is negligible after the age of 16 .
    ${ }^{24}$ For example, birth cohort 1973 in Puebla

[^13]:    ${ }^{25}$ All variables from the 1970 Anuario Estadístico de los Estados Unidos Mexicanos.
    ${ }^{26}$ We also find no correlation with changes in employment or literacy rates between the 1960 and 1970 census. Results available upon request

[^14]:    ${ }^{27}$ State level population density is not uniform across all areas, and thus likely does not capture the size of the susceptible population. Indeed, we find that state population density and urbanization rates are not significantly correlated with pre-vaccine measles rates. These results are available upon request.
    ${ }^{28}$ Indeed, a report on the school calendars mentions that one reason calendar B is more problematic is that students are in class during the high flu/cold season (Alvarez Barret 1969)
    ${ }^{29} 18$ out of 32 states are assigned to Calendar B. We took this designation from from the 1966 statistical annual, Table 6.13). The list of the calendar regimes for each state is in Appendix Table A1

[^15]:    ${ }^{30}$ During 1976-1977 there were worldwide epidemics of swine flu and measles. This coincides with the two years of smaller estimates where the estimate is not statistically different from zero. The sign for each of these estimates is negative and the confidence intervals include negative one.
    ${ }^{31}$ Data on these diseases come from the 1965 to 1978 annual epidemiological bulletins published in the Salud Pública de México.

[^16]:    ${ }^{32}$ Ideally we would also include event study figures for pertussis and tetanus; but they are not included in the infectious disease reports.

[^17]:    ${ }^{33}$ They also have consistent codes over time. The coding system for mortality causes changed in 1970.

[^18]:    ${ }^{34}$ In Appendix Table A2 we estimate less than primary and primary as separate categories of educational attainment. We find significant declines in less than primary (less than six years of schooling) and smaller and insignificant changes in primary education. Thus we we do not find strong evidence that the increased years of schooling is coming from the completion of primary school.

[^19]:    ${ }^{35}$ Lucas 2010 finds positive educational attainment for malaria eradication in Paraguay and Sri Lanka, but only for women.
    ${ }^{36}$ Venkataramani 2012 finds positive impacts of malaria eradication on cognitive test scores and on-time educational attainment but no effect on the years of schooling attained.

[^20]:    ${ }^{37}$ In Bleakley's 2010 paper examining the impact of malaria eradication campaigns in the United States, Mexico, Brazil, and Columbia, larger effects on income are found in Mexico, Brazil, and Columbia compared to the U.S. These are attributed to the greater benefit provided by eradication in locations with higher infectious disease burdens.

[^21]:    ${ }^{38}$ For example, the average number of households that report receiving remittances in high migration municipalities is $18.6 \%$, while the percentage who report an outmigrant is $16.8 \%$. This compares to values of 3.5 and $3.7 \%$, respectively, for low migration areas.
    ${ }^{39}$ We also defined migration networks using measures of historical access to train travel to the U.S. (Chiquiar et al., 2012) The results are presented in Appendix Table A10

[^22]:    ${ }^{40}$ We thus include groups who were born between 1935 (age 21 in 1956) and 1957 (one year out from the fake start date).

[^23]:    ${ }^{41}$ Appendix Table 7 present estimates for including the region-by-year-of-birth fixed effects in the models with income, education and migration as the outcome variables of interest. The estimates remain consistent with our main results for all outcomes of interest and across all data sets used for analysis.

[^24]:    ${ }^{42} R_{0}$ (the reproduction number) is the number of cases, on average, an infected person will cause during their infectious period. The basic reproduction number represents the maximum epidemic potential of a pathogen. It describes what would happen if an infectious person were to enter a fully susceptible community.
    ${ }^{43}$ https://www.who.int/news/item/10-11-2021-global-progress-against-measles-threatened-amidst-covid-19-pandemic

