

International Job Search: Mexicans in and out of the U.S.*

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Abstract.- It is argued that migration from Mexico to the US and return migration are determined by international wage differentials and preferences for origin. We use a model of job search, savings and migration to show that job turnover is a crucial determinant of the migration process. We estimate this model by Simulated Method of Moments (SMM) and find that migration practically disappears, it goes down from 19% to 0.5%, had Mexico US arrival rates while employed. A lower decrease in migration, to 7%, occurs by an increase in Mexican wage offers. On the other hand, doubling migration costs reduces migration rates from 19% to 5%, while subsidizing return migration in \$300 reduces migration rates only to 14%.

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1 Introduction

International migration between two countries is a process whereby migrants cross borders bidirectionally.¹ Mexico and the US are two neighboring countries with a particularly intensive dynamics of migration and return migration: in year 2000 Mexican migrants in the US represent above 10% of the Mexican labor force, many of which return back to Mexico.² It is argued that this migration process depends basically on international wage differentials and preferences for origin. In this paper we use a model of job search, savings and migration to show that migration and return migration heavily depend not just on wage differentials or preferences, but also on job turnover and, in particular, on job-to-job transitions. To a great extent, Mexicans migrate to the US seeking job mobility, which they do not totally find in their own country.

This is the first paper to explain international migration in close connection with the process of job search. We propose a model in which individuals search for jobs and accumulate wealth in two labor markets. We structurally estimate this model to match observed patterns of migration, wage growth and job turnover in Mexico and the US and analyze several potential regime changes. Our main result is that a more dynamic labor market in Mexico, assigning Mexico the US arrival rates while employed, reduces migration rates from Mexico to the US to very low levels. Migration from Mexico is caused by faster job mobility, the speed for moving to better paid jobs, not just by higher wage levels in the US.³ This decrease in migration is substantially

¹In 1908-1910 on average 32% of immigrants to the US returned to their countries (Piore 1979). Between 1960 and 1970 half of the annual flow of immigrants to the US returned home (Warren and Peck 1980) . In fact, temporary migration is important for many countries (Dustmann, 2003). Aydemir and Robinson (2006) document outmigration rates in several countries, ranging between 22% and 55%. This process is very specific to the country of destination, for example, in Canada outmigration flows go to a third country, and highly heterogeneous by country of origin (Jasso and Rosenzweig 1982) .

²Available studies estimate migration rates of 11.68% (Chiquiar and Hanson 2005) and return migration rates of 42.6% (Jasso and Rosenzweig (1982) and 66% (Reyes 1997).

³Mexico has a more flexible labor market in terms of job turnover than other Latin-American countries, which have similar labor market regulations (Maloney 1997, Frenkel and Ross 2004); it is however less flexible than other OECD and industrial countries (Calderon-Madrid 2000, Heckman

larger than the one produced by a comparable increase in wage offers in Mexico.⁴ On the other hand, doubling migration costs from Mexico to the US reduces the highest migration rates from 19% to 5%, while subsidizing return migration in \$300 reduces the highest migration rate from 19% to just 15%. Thus, increasing migration costs is shown to be effective in decreasing migration from Mexico to the US.

These new results come from analyzing jointly migration turnover and job search dynamics. So far, migration has been explained by mechanisms based on international wage differentials,⁵ which only generate one-directional migration (Sjaastad 1962) To explain return migration the literature has extended these mechanisms to allow for incomplete information, heterogeneity in preferences for origin, and higher returns to capital or human capital in origin countries.⁶ These type of migrants are typically called target savers (Massey et al.) and these models life cycle explanations (Yang 2006). Thus, the literature has evolved to analyze migration using dynamics models that allow for bidirectional migration over the life cycle.

An important aspect studied by these models is the concept of social networks formed by migrants, which was first noted by Piore (1979). Piore study of Mexican migrants in the US describes how individuals that migrate illegally from Mexico to the US help each other in the migration process, starting from the crossing of the

and Pages-Sierra 2000).

⁴As explained in Section 6, a comparable increase in wage offers in Mexico is defined as one that matches the average wage in Mexico at age 45 produced by arrival rates while employed in Mexico being the same as in the US at all ages.

⁵These mechanisms are unemployment or wage differentials (Harris and Todaro 1970), expected wages, probabilities of employment and tax rates, and the probability of being deported in the destination country (Todaro and Maruszko 1987), adverse selection and poverty traps (Bencivenga and Smith 1997).

⁶Incomplete information can be of job searchers about the destination labor market (Herzog and Schottman 1982) or of employers about the quality of workers (Katz and Stark 1987, Hendricks 2001). Heterogeneity can be of migrants in preference for origin (Hill 1987, Djajic and Milbourne 1988, Raffalhüschén 1992, Cuecuecha 2008) or in aversion to inequality in a context of incomplete insurance markets (Stark 1984, Stark and Yitzhaki 1988). Higher returns in origin countries can be to physical capital (Borjas and Bratsberg 1996, Lindstrom 1996) or to human capital (Dustmann and Kirchkamp 2002), as looser credit constraints (Mesnard 2004) or as higher purchasing power (Dustmann 1997, Stark, Helmenstein and Yegorov 1997, Dustmann 2003). Actually, some authors base their explanations on several of these mechanisms (Yang 2006).

border, and then with job referrals and sharing living expenses in the US. Massey et. al. (1987) showed the importance of migrant networks by finding that knowing individuals in the US increases the migration probability. Munshi (2003) also showed that Mexican migrants with networks have better wages and higher probability of being employed. The importance of social networks has been confirmed for other Latin American immigrants in the US (Massey and Aysa, 2005). Recent analysis, however, have found that migrant social networks do not work always with the same efficiency and that their results over migration depend on specific factors particular to the communities where the migrants originate (Garip, 2008). For some authors, what matters is not only the social network but the social capital embedded on it. According to Putnam (1993) the social capital is defined as the norms, trust and networks that can improve efficiency in the society by facilitating coordination and cooperation. Under this interpretation, social networks can some times also deter migration (Banerjee and Newman, 1997). This is because sometimes social capital needs of strong ties and reciprocity mechanisms that requires that the participants be present and near from each other (Faist, 2000). All dynamic economic models of migration that have included networks focus their attention in the formation and impact of social networks formed by migrants (Delechat 2001, Angelucci 2002, Haslag, Guzman and Orrenious 2004, Colussi 2006, Kennan and Walker 2006, Gemici 2007).

Delechat finds that the probability of working in the US increases with the own personal US experience, as well as with the existence of family migrant networks and larger migration prevalence in the community. Angelucci (2002) estimates a dynamic model of migration in which higher migration costs will deter some people from migrating, but it will also increase migrants' duration in the US. Haslag et al. (2004) propose an overlapping generations model in which individuals can invest in the formation of social capital, which depends on the number of people from the family that are in the US and in the investment they made in the network. The network here provides not only with job offers in the US, but also with transfers when old.

Colussi (2006) estimates a dynamic general equilibrium model of migration and finds that the existence of networks generates an S-shaped migration process, in which migration first increases at an increasing rate and then slows down. He also shows that increasing migration costs increase migration levels as individuals stay longer in the US. Kennan and Walker (2006) propose a model of migration to several locations with specific income prospects; thereby, migration dynamics is conceived of actually as a process of search for the best geographical match. Gemici (2007) estimates a model of married couples' migration and employment decisions, finding that migration events tend to occur mostly as a response to men's opportunities.

In our model, agents look for jobs and accumulate wealth in one country, but can move to the neighboring country paying a monetary cost of migration. We estimate this model by Simulated Method of Moments (SMM) to match observed migration and return migration, job search outcomes and turnover in both labor markets. Data come from the Mexican Migration Project (MMP), Mexican and American employment surveys (ENEU and CPS) and the census. Using the recovered behavioral parameters of the model we perform simulations of counterfactual scenarios, characterized by US arrival rates while employed in Mexico, a higher wage offer distribution in Mexico, higher migration costs from Mexico to the US and a subsidy to return migration to Mexico. Our main variables of interest are migration rates and flows between Mexico and the US. These experiments, which are not obvious to implement in a reduced form approach, are very straightforward to carry out in a structural framework.

We also introduce the concept of a *retention wage*, the lowest acceptable wage to stay in the current location, in interaction with the *reservation wage*, the lowest acceptable wage to accept a job. When agents are initially in Mexico, they accumulate wealth to pay the migration cost. Once they can pay it, they move to the US and stay there until they have saved some level of wealth. Once this target is accomplished, agents return to Mexico. Only agents of high wages and high levels of wealth stay in the US.

The remainder of the paper is organized as follows. The next section explains and characterizes a model of job search, migration and savings; Section 3 describes the different datasets used, as well as the criteria chosen to select the sample and the moments used in the estimation. We also present descriptive statistics for these data. Section 4 details the estimation method, a simulated method of moments. Section 5 discusses and interprets the estimation results and provides goodness of fit tests. Section 6 performs counterfactual experiments of improvements of labor markets in Mexico, characterized by higher arrival rates while employed and better wage offers in Mexico, and variations of migration costs. Finally, Section 7 summarizes the paper's main conclusions.

2 Model

In this model agents seek to maximize their expected lifetime utility without bequests by choosing their location, consumption and acceptable wage offers. At each period they derive utility of consumption, given by the period-by-period utility function $U(\cdot)$, and enjoy a utility premium ψ , when they are in their home country. Agents are active, employed or unemployed, for $T = 52$ years (13-65) after which they retire and live off their savings without ever going back to active life, for a maximum of $\bar{T} = 75$ years (15-90). Location is denoted by k ($= 0, 1$), where 0 stands for their home country, Mexico, and 1 for the destination country, the US. All agents enter active life as unemployed in their home country ($k = 0$) and with an initial stock of wealth A_0 . Before engaging in job search activity an agent has to decide whether to stay in his current location or migrate. If an agent decides to migrate, he has to pay a relocation-specific-migration cost c^k and enters the new labor market as unemployed. Agents can always switch location, but only throughout their working lifetime they can experience employment transitions.

Conditional on their wealth A_t , their location, and their employment status agents

decide how much to consume C_t , therefore their desired level of wealth for the next period A_{t+1} , and their employment transitions. They have a subjective discount factor is $\beta \in (0, 1)$, can save at rate of return r , but cannot borrow.⁷ When unemployed, conditional on their location, they receive a wage offer x with age-dependent probability λ_t^k , drawn from a wage offer distribution $F^k(\cdot)$, ($x \in (\underline{w}, \bar{w})$, $0 < \underline{w} < \bar{w} < \infty$). Unemployed agents receive transfers b^k , which include non-labor income, like family transfers, plus unemployment compensation net of out-of-pocket search costs. When employed, they get laid off with probability θ_t^k and with probability π_t^k they receive a wage offer drawn from the same distribution $F^k(\cdot)$. Arrival rates, λ_t^k and π_t^k , layoff rates θ_t^k , and wages $w_t(\omega, k)$ are age- and location- specific, both in initial levels as in growth rates. The evolution by age of these labor market parameters captures the accumulation of human and social capital over time, that is, on-the- job training and assimilation of migrants, by means of social networks, to the destination labor market.⁸

While unemployed, they become employed if they receive and accept a wage offer; otherwise they remains unemployed. While employed, they change employer when they receive an offer and accept it; they stay working for the same employer when they are not laid off, receive an offer that they do not accept or no offer at all, and the current job is preferable to unemployment; they can always quit to become unemployed.

The present discounted utility V_t^R of a retired agent of age t ($= T + 1, \dots, T_F$),

⁷The ‘natural’ borrowing limit under free capital markets is set at the level which individuals can repay back with probability one. In this setup, however, because agents can move from one location to the other and never come back, this borrowing limit is zero: there is no way to guarantee debt repayment.

⁸If we had data on transfer while unemployed we could make b^k depend also on age. Because wage and arrival and layoff rates are already evolving by age, an age-specific b^k would not be identified by our available dataset.

wealth holdings A_t , and location k is

$$V_t^R(A_t, k) = \max_{\{A\}_{s=t+1}^{T_F}} \sum_{s=t}^{T_F} \beta^{s-t} \left[U \left(A_s - \frac{A_{s+1}}{1+r} \right) + (1-k)\psi \right],$$

where, in the absence of bequest motives, $A_{T_F+1} = 0$. With agents saving voluntarily for retirement, with full control over their pension funds, the dynamic problem becomes ‘a cake-eating problem.’⁹ The solution to this problem is contained in the wealth accumulation rule $A_{t+1}^R(A_t)$.¹⁰

Expected lifetime utility V_t^u in the unemployment state at age t ($=1, \dots, T$), wealth holdings A_t , and location k is defined as

$$V_t^u(A_t, k) = \max_{A_{t+1}^u \geq 0} \left\{ U \left(A_t + b^k - \frac{A_{t+1}^u}{1+r} \right) + (1-k)\psi \right. \\ \left. + \beta \max [W_{t+1}^u(A_{t+1}, k), W_{t+1}^u(A_{t+1} - c^k, 1-k)] \right\},$$

where

$$W_t^u(A_t, k) = \lambda_t^k \int \max [V_t^e(A_t, x, k), V_t^u(A_t, k)] dF^k(x) + (1 - \lambda_t^k) V_t^u(A_t, k).$$

In the employment state, expected lifetime utility V_t^e at age t ($=1, \dots, T$), wealth holdings A_t , wage ω , and location k is

$$V_t^e(A_t, \omega, k) = \max_{A_{t+1}^e \geq 0} \left\{ U \left(A_t + w_t(\omega, k) - \frac{A_{t+1}^e}{1+r} \right) + (1-k)\psi \right. \\ \left. + \beta \max [W_{t+1}^e(A_{t+1}, \omega, k), W_{t+1}^u(A_{t+1} - c^k, 1-k)] \right\},$$

⁹The institutional mechanisms of a pension system (characterized by schemes of contribution during working lifetime and pensions during retirement) are beyond the goal of this paper. This highly stylized analysis, however, will prove able to generate savings for life-cycle motives.

¹⁰Notice that under certain utility functions and $\beta(1+r) < 1$ retirees will monotonically run down their assets until they are zero. If retirees can still migrate to enjoy ψ , they will prefer to do that early on, actually before they retire, because later their assets will go down over time. Thus, if they have not changed location until they reached retirement age, they will not migrate when they are retired. Location at retirement is an absorbing state.

where

$$\begin{aligned}
W_t^e(A_t, \omega, k) &= (1 - \theta_t^k) \left(\pi_t^k \int \max [V_t^e(A_t, x, k), V_t^e(A_t, \omega, k), V_t^u(A_t, k)] dF^k(x) \right. \\
&\quad \left. + (1 - \pi_t^k) \max [V_t^e(A_t, \omega, k), V_t^u(A_t, k)] \right) \\
&\quad \left. + \theta_t^k \left(\pi_t^k \int \max [V_t^e(A_t, x, k), V_t^u(A_t, k)] dF^k(x) + (1 - \pi_t^k) V_t^u(A_t, k) \right) \right].
\end{aligned}$$

Active agents solve a dynamic problem (DP) with a finite horizon T and a ‘salvage value’ which is the present discounted utility at retirement: $V_t^u(A_t, k) = V_t^R(A_t, k)$, $V_t^e(A_t, w, k) = V_t^R(A_t, k)$, at $t = T + 1$. Two policy rules $A_{t+1}^u(A_t, k)$ and $A_{t+1}^e(A_t, w, k)$ solve this problem. Whether the individual is employed or unemployed, there exists a reservation wage that indicates the lowest acceptable wage offer, that is, $\omega_t^*(A_t, k) \equiv \{\omega \mid V_t^u(A_t, k) = V_t^e(A_t, \omega, k)\}$. Similarly, agents migrate when unemployed, if: $W_t^u(A_t - c^k, 1 - k) > W_t^u(A_t, k)$ and when employed, if: $W_t^u(A_t - c^k, 1 - k) > W_t^e(A_t, \omega, k)$. Define $\omega_t^{**}(A_t, k_t) \equiv \{\omega \mid W_t^u(A_t - c^k, 1 - k) = W_t^e(A_t, \omega, k)\}$ and call it the *retention wage*.

Proposition 1 $V_t^e(A_t, \omega, k)$ and $W_t^e(A_t, \omega, k)$ are increasing in ω . Thus, the reservation wage property exists both for retention and reservation wages. *Proof:* In Appendix A1.

Thus the retention wage indicates the lowest wage that keeps individuals in their current location; individuals who are employed at a wage lower than $\omega_t^{**}(A_t, k)$ will migrate. Let the indicator function $I_t^m(A_t, k) \equiv I(W_t^u(A_t - c^k, 1 - k) > W_t^u(A_t, k))$ denote whether an unemployed individual will migrate to the other country.

Proposition 2 If $\pi_t^k < \lambda_t^k$, then for an individual with wealth A_t and of age t $I_t^m(A_t, k) = 1$, implies $\omega_t^{**}(A_t, k_t) > \omega_t^*(A_t, k_t)$ and $\omega_t^*(A_t, k_t) > \omega_t^{**}(A_t, k_t)$, implies $I_t^m(A_t, k) = 0$, $k = 0, 1$. *Proof:* In Appendix A1.

That is, if unemployed individuals migrate, so do the employed at low wages,

and only individuals employed at high wage stay; on the other hand, if all employed individuals are retained in their current location, so are the unemployed.

Because there are no closed-form solutions, we assume specific functional forms:

- constant relative risk aversion (CRRA) utility function $U(C) = \frac{C^{1-\gamma}-1}{1-\gamma}$;
- truncated lognormal base wage offer distribution $F_k(x)$: $\ln \omega \sim N(\mu_k, \sigma_k^2 | \underline{\omega}, \bar{\omega})$; $0 < \underline{\omega} < \bar{\omega} < \infty$, $k = 0, 1$;
- logistic function for age-dependent arrival and layoff rates: $q_t^k = \frac{\exp(\alpha_q^{0k} + \alpha_q^k t)}{1 + \exp(\alpha_q^{0k} + \alpha_q^k t)}$, where $q = \{\lambda, \pi, \theta\}$, $k = 0, 1$. (In the estimation, we will report $q_0^k = \frac{\exp(\alpha_q^0)}{1 + \exp(\alpha_q^0)}$ and a_q , the initial arrival and layoff rates and their associated variation parameters.);
- wage growth function: $w_t(\omega, k) = \omega \exp(\alpha_1^k t + \alpha_2^k t^2)$.

We approximate the policy rules and value functions with a numerical solution attained by discretization of the state and choice space into a grid of points. Appendix A2 provides further details on this procedure.

3 Data

Data come from five sources: the Mexican Migration Project (MMP124) data set, the Mexican and the US Censuses of 2000, the first to fourth quarters waves of the Mexican Urban Employment survey (ENEU-*Encuesta Nacional de Empleo Urbano*) for 1999, and the January to December waves of the Current Population Survey (CPS) for 1999. In all these data sets we only consider 15 to 45 year old males, who are not disabled or incarcerated. We also exclude individuals for which there is only one observation, except in the two censuses. In Appendix A3, Table A1, we report how each of these selection criteria reduces the amount of observations in the final sample.

From the MMP124 we obtain migration rates, flows of Mexicans going into the US and returning from the US and job-to-job transitions. This is the only source of information we are aware of on job-to-job transitions in Mexico and for Mexicans in the US. This is a data base developed by Princeton University and the Universidad de Guadalajara. It surveys 124 communities in 21 Mexican states from 1982 until 2008; it is more representative of rural Mexico. Each year the survey chooses a set of communities that are interviewed during winters, while a follow up survey is done during summers for individuals residing in the US. Our final sample consists of 9,225 individuals.

From the MMP124 we obtain the migration rate by age and changes in jobs by individuals also by age. To calculate the migration rate by age we obtain the proportion of individuals of a given age that were located in the US, regardless of the calendar year in which that individual is located. By doing so, we average out the migration rate across the 124 communities and across time. We do this to maximize the number of observations by age that qualify with all our selection criteria. The change in jobs variable is obtained from the labor history of the individuals. We obtain this measure by using an indicator variable for the event change in job reported by the individual, conditional on the individual reporting to be employed in the previous year. We then obtain the proportion of individuals of a given job that report changing jobs, conditional on being employed the previous period. We are not aware of any other data set that contains this measure for Mexican individuals.

From the Mexican and US. Censuses we obtain annual wage incomes in PPP dollars.¹¹ We use a 10% sample of the 2000 Mexican Census. After performing the selection by age, gender, incarceration and disability, we end up with approximately 1.7 million observations to estimate moments from this data set. From the US.

¹¹We could use the exchange rate instead of the PPP rate. The former does a better accounting for transferring assets across borders, which is part of the target saving behavior, but is worse for comparing utilities across borders, which is crucial for the migration and return migration decision. The way our model specification is capturing the transfer of assets across borders is through migration costs, which absorb any discrepancy between these two rates.

Census (IPUMS data base) we use a 5% sample of Mexicans, which, after applying the mentioned selection filters, reduces to approximately 134 thousand observations

Information on unemployment rates, exit from unemployment, and job loss comes from Mexican and American employment surveys. For Mexico we use the first to fourth quarter waves of the ENEU of 1999, of which we select 113 thousand observations. Unlike the MMP, this data set is representative of urban Mexico. It is a quarterly rotating panel on employment status, employment transitions and wages of individuals. We annualize the observed quarterly transitions under the assumption that transition rates are time independent, that is, we calculate the probability that an individual in a given quarter is observed a year later with a different employment status. For the US we use the CPS 1999, January to December waves, which a representative data set of the US population. It provides also with a rotating panel on employment status, employment transitions and wages of individuals. We only include in the study individuals that claim to be born in Mexico, around 3 thousand individuals. As with the Mexican survey, we annualize the monthly employment transitions under the assumption that transition rates are time independent. Further details on the sample selection, the choice of data sources and comparison of our data with those reported in previous studies are provided in Appendices A3-A5.

[Table 1 here]

Table 1 shows migration, wage and unemployment variables by country, age bracket and dataset. The migration stock is 11% among individuals 16 to 25, 16% among individuals 26 to 35, and 15% among individuals 36 to 45 years old. It is also shown that both migration and return migration flows are decreasing, but the former are on average 2.9%, while the latter are on average 14%. The wage gap between Mexico and the US is wide and increasing with age. The standard deviation of log wages decreases with age in the US, while it increases with age in Mexico. Unemployment rates are higher in Mexico than in the US for young cohorts but fall faster in Mexico

than in the US, so that for older cohorts they are higher in the US than in Mexico. Something similar happens with exit from unemployment and job loss: initially they are better in the US than in Mexico, but over time they improve in Mexico and end up overtaking those in the US. However, average job-to-job transitions are decreasing and always higher in the US than in Mexico. These transitions will prove to be very important in accounting for the observed migration patterns. We will show that wage differentials and faster job-to-job transitions in the US are an incentive for Mexicans to migrate, but as job taking and job loss transitions improve in Mexico and wealth accumulation occurs, older cohorts prefer to return to Mexico.

4 Estimation

The estimation strategy is designed to recover the behavioral parameters of the theoretical model. We assume that individuals start off their careers with a wealth level drawn from a parametric initial wealth distribution and, for each parameter set, we compute the policy rules that solve the DP problem and use them to generate simulated careers paths. Then, at each iteration of the parameter computation we construct a measure of distance between the observed and the simulated moments. The estimation is a Simulated Method of Moments (SMM) procedure in which the parameter estimates of the theoretical model are the minimizers of this function.

All individuals start off their careers at age 13, unemployed in Mexico, with a wealth level A_0 drawn from a displaced truncated log-normal initial wealth distribution: $\ln(A_0 + 1) \sim N(\mu_0, \sigma_0^2 | 0, \bar{A})$. Then we use the model to simulate 50,000 individual trajectories and compute several moments that are matched to the observables. In the construction of the criterion function, we only use observations from age 15 until age 45, so that we have distances between simulated and observed moments for 30 years for each selected moment. We use age 15 as a starting point to allow that the simulated trajectories become disperse over locations, employment status,

and wages over two years. We also focus on early employment careers, accordingly we restrict our estimation to individuals that are less than 45 years old.

The parameters¹² to estimate are then the following: $\Theta = \{\Theta^0, \Theta^1, C_\psi, \gamma, \mu_0, \sigma_0\}$, with $\Theta^k = \{b^k, \lambda^k, \alpha_\lambda^k, \pi^k, \alpha_\pi^k, \theta^k, \alpha_\theta^k, \mu^k, \alpha_1^k, \alpha_2^k, \sigma^k, c^k\}$. The moments used in this estimation are the cell-by-cell probability masses for the following migration and employment distributions, as well as wage moments:

1. migration rates and flows (30 years \times 1 moment=30),
2. migration and return migration flows: (30 years \times 2 moments=60),
3. wage moments (30 years \times 2 countries \times 3 moments=180),
4. employment status (30 years \times 2 countries \times 1 moment=60),
5. employment transitions (30 years \times 2 countries \times 3 moments=180).

Thus, there are 510 moments to estimate 28 parameters. The SMM procedure relates a parameter set to a weighted measure of distance between sample and simulated moments:

$$S(\Theta) = \Delta m' W^{-1} \Delta m,$$

where Δm is the distance between each sample and simulated moment and W is a weighting matrix. In this research, because our main interest is to fit migration observations, we give these variables absolute priority over the others: we use a diagonal matrix W that weighs migration moments ten times as employment and wage moments. The estimated behavioral parameters are thus $\hat{\Theta} = \arg \min S(\Theta)$. The identification of the parameters of this function is given by employment and location transitions as well as wage data. The arrival rates while unemployed and employed and the layoff rates, as well as their variation rates are mostly identified

¹²We report $C_\psi = U^{-1}(\psi)$ to have some intuition about the value of the preference for origin parameter in monetary terms.

by the employment transitions by age: exit from unemployment, job loss and job-to-job transitions.¹³ Observed wage moments by country identify mainly the location-specific parameters of the wage offer distribution and of wage growth, as well as unemployment transfers. Identification of migration costs and preference for origin comes mainly from migration rates and migration flows by age. Identification of the coefficient of the utility function for consumption and parameters of the initial wealth distribution comes from the interaction of labor market and location transitions.

The criterion function is minimized using Powell’s method (Press et al.) , which requires only function evaluations, not derivatives. Asymptotic standard errors are calculated using the outer-product gradient estimator.

5 Estimation Results

In this section, we discuss the parameter estimates and compare graphically and numerically actual and fitted moments. The parameter estimates in Mexico and in the US and their corresponding asymptotic standard errors are reported in Table 2.

[Table 2 here]

These estimated parameters reflect closely the patterns described by the observed moments. Thus, higher estimated unemployment transfers in the US capture higher wages in the US. Arrival and layoff rates reflect employment transitions: the base arrival rate while unemployed is higher in the US, but its corresponding growth parameter is higher in Mexico, which correspond to the age profile of the exit from

¹³For instance, the expression for the theoretical exit from unemployment in country k at age t is $\Pr(e | u) = \lambda_t^k [1 - F_k(\omega_t^*(A_t, k))]$, that is, it depends on the arrival rate λ_t^k , the wage offer distribution F_k , and the reservation wage $\omega_t^*(A_t, k)$. The wage offer distribution net of wage growth is mainly identified by the observed mean wage, mean log-wage and standard deviation of log-wages, which also determine reservation wages, so that the arrival rate is identified by the observed exit from unemployment. A similar identification criterion, but with more complicated expressions, applies for the other employment transitions.

unemployment. The same occurs with layoff rates, whose base value is higher in Mexico but experiencing a faster decrease over time. Similarly, as shown by the job-to-job transitions by age, arrival rates while employed are always higher in the US. And, as wages are always higher in the US, the mean, variance and growth parameters of log wages show a higher mean, slightly lower variance in the US than in Mexico and similar wage growth parameters. These results suggest that human and social capital accumulation in the US. is altogether slower than in Mexico.

The cost of migration is estimated at \$882, while the cost of return migration at \$27. Since wealth has been discretized and these parameters are substracted directly from wealth values, they are very closely related to the gridsize which amounts to \$600. We checked whether these values are different from zero and only rejected that the cost of migration were zero. The return migration cost is not significantly different from zero.

Attachment to origin is estimated at around \$1453, almost half of the annual wage in Mexico for young cohorts (16 to 25 years old). The coefficient of risk aversion is estimated to be 0.56,¹⁴ while the initial wealth distribution denotes a very high dispersion in initial wealth. Notice that in this estimation we do not have wealth data, so that, as noted above, identification of these parameters comes from the interaction of labor market and location transitions. The initial wealth distribution indicates that unobserved heterogeneity in initial conditions is potentially very important and that a wide dispersion is required to fit the data.¹⁵

It is instructive to show what these parameters imply for the dynamics of migration and employment transitions. We use these parameters to graph reservation and retention wages, as well as the migration indicator function for the unemployed in

¹⁴This estimate is comparable to other studies, which typically find values ranging between 0.2 and 2. Estimates of this parameter ara model and dataset-specific. Keane and Wolpin (2001) estimate this parameter at 0.483, Imai and Keane (2004) find it to be 0.738, and Rendon (2006) at 1.483.

¹⁵Heterogeneity in initial wealth is the simplest and most tractable way of allowing for unobserved heterogeneity, as it only affects initial conditions and does not require solving the dynamic programming problem more than one time. An extension with unobserved heterogeneity in other parameters and using wealth data, provided their availability, is left for future research.

Figures 1 for Mexico and in Figure 2 for the US. They are both evaluated at age 23.

[Figure 1 here]

Figure 1 is illustrative of the employment and migration dynamics that agents experiment when they are in Mexico. While reservation wages are increasing, retention wages, except for very low levels of wealth, are decreasing in wealth. As agents become wealthier they are more selective in their *wage aspirations to become employed*, but less demanding in their *wage aspirations to stay in their country*. Consequently, more wealth increases the hazard rate of becoming employed while decreasing the hazard rate of migrating to the US. At very low levels of wealth, almost zero wealth, employed agents stay in Mexico, even if they are employed at high levels of wages, as migrating is a risky decision, and shy away from being in the US with zero wealth. For them the migration costs is a strong barrier to migration. The same applies to the unemployed with very little wealth, who also stay in Mexico because they cannot pay the migration cost. With some more wealth, between 0 and around 2000 dollars worth of wealth, the unemployed migrate to the US, and with wealth around 7000 dollars worth and above, they stay in Mexico. When agents are employed, they stay at very low levels of wealth, no matter how high their wages are. With some more wealth, agents migrate if wages are low and stay at high wages. And, at high levels of wealth, no agent, employe or unemployed, migrates. That is, the segment that migrates to the US has little wealth and is unemployed or employed at relatively low wages.

[Figure 2 here]

Figure 2 depicts the employment and migration dynamics of agents who are currently in the US. Unlike in Mexico, while reservation wages are decreasing, retention wages are increasing in wealth. Being wealthier makes agents *less selective in their job search*, but *more selective in their return migration decision*. This implies that

wealth increases the hazard rate of becoming employed and of returning to Mexico. Like in Mexico, agents with very low wealth levels stay, whether they are employed, no matter at what wage level, or unemployed. Unemployed agents with wealth levels less than 10,000 dollars worth stay in the US, while those with more than that return to Mexico. Like in Mexico, low wage agents return, while, high wage individuals stay.

In sum, in both locations wealth accumulation increases individuals' selectivity in their job and location search: in Mexico it increases their selectivity in job search and retains them in Mexico, while in the US it decreases their selectivity in job search and propels return to Mexico. Consequently, wealth accumulation is a force that keeps individuals in Mexico or, if they are in the US, makes them return to Mexico.

Although most of the parameter estimates are significant at the 5% significance level, it is often the case than in the estimation of structural models standard errors are very low. Accordingly, we provide some extra measures of fit for our estimation, starting with showing figures of how well the model matches the observed moments in the data. Figures 3a to 4h illustrate the results obtained by the estimation.

[Figure 3 here]

Figures 3a and 3b show that the observed migration rate and flows are well fit by our predictions, which mimic the inverted U-shaped migration rate and flows and the decreasing return migration patterns. Figures 3c and 3d show that wage levels for Mexico and the US are well replicated by the model, while mean log-wages are somewhat underpredicted, as shown in Figures 3e and 3f. The standard deviation of log-wages, Figures 3g and 3h, are observed to increase with age in Mexico, while it is observed to decline with age for Mexicans in the US. We predict a fairly stable standard deviation that tends to decrease over time, as it occurs in search models: as individuals accumulate wealth, their reservation wage increases and the accepted wage offer distribution is truncated at higher levels (see Rendon 2006, 2007).

[Figure 4 here]

Figure 4 compares actual and predicted employment variables. Replication of unemployment rates is fairly good for Mexicans both in Mexico and in the US, Figures 4a and 4b, respectively. The probability of leaving unemployment in Mexico, Figure 4c, is replicated with some overprediction for young cohorts; for older cohorts the predicted level goes down, while the actual levels are pretty stable. This decline in Mexico is caused by Mexicans who return wealthy from the US and are therefore more selective in accepting jobs. For the US, in Figure 4d, replication is pretty good, but with some underprediction for middle-aged agents. As is shown in Figure 4e and 4f, the decreasing pattern of job loss in both countries is fairly well replicated by the model. Job-to-job transitions and their decreasing trend in both countries are also well replicated by the model, however with some underprediction in both cases, in Figures 4g and 4h.

[Table 3 here]

To assess more formally how well the parameter estimates capture the essential features of the data, in Table 3 we compare the observed and the predicted moments and perform goodness of fit tests. The test statistic across discrete choices j at time t is defined as $\chi_j^2 = \sum_{t=1}^{30} \frac{(p_{jt} - \hat{p}_{jt})^2}{\hat{p}_{jt}}$, where p_{jt} is the actual number of observations of choice j at time t , and \hat{p}_{jt} is the model predicted counterpart. This statistic has an asymptotic χ^2 distribution with $T - 1$ degrees of freedom. A larger χ^2 implies that our model deviates more from the observed moments. Consequently, the null hypothesis tests whether the distance between observed and predicted moments is zero, which is clearly rejected. For continuous variables we report the R^2 statistic defined as $R^2 = \frac{\sum \hat{Y}^2}{\sum \hat{Y}^2 + \sum e^2}$, where \hat{Y} is the predicted variable and $e = Y_{obs} - \hat{Y}$ is the predicted error.¹⁶ Our R^2 statistics confirm the graphical analysis that our moments match correctly the data

¹⁶Unlike in the linear regression framework, this statistic is not bounded between zero and one, because it is not necessarily true that $\sum \hat{Y}e = 0$.

In sum, the estimated model is shown to be able to replicate well the observed patterns in the data. In the next section, we use the model to evaluate the results of variations in the recovered parameters.

6 Regime Changes

After recovering the underlying behavioral parameters, we explore how do the predicted trajectories change under alternative scenarios: improvement of labor market conditions in Mexico and migration costs variations. Since we have a very complete dynamic model we can evaluate counterfactuals and policy experiments and their effects in several dimensions, in a way that a reduced form model would not allow us to do. We report the results of these experiments in Figures 5 and 6 and in Table 4.

[Table 4 here]

Our first exercise consists of assigning Mexico the US arrival rates while employed at all ages, which is indicative of how would migration from the US change if the Mexican labor market were more mobile. Therefore, we assess the importance of job reallocation in the migration process, without changing the wage offer distribution, more closely related to the distribution of firms' productivities in Mexico. The mean estimated arrival rate while employed in the US is 0.77, while its Mexican counterpart is 0.17; consequently this exercise increases the arrival rates while employed in Mexico by a factor of 3. Column 1 in Table 4 shows the results of this exercise for selected estimated moments. Results in terms of migration rates are striking: the highest migration rate drops from 19% at age 25, to 0.5% at age 35. Migration from the US to Mexico practically disappears: there is a dramatic reduction in the annual flows of immigrants and a substantial increase in return migration flows. The highest migration flow falls from 5% to 0.3% , while the highest return migration flow increases from 22% to 86% . These changes generate a reduction in the average duration of

migration and a reduction in the mean number of times that individuals spend in the US. We also observe that as individuals change jobs more frequently, average annual wages increase from \$5600 to \$7900. Similarly the unemployment rate at age 45 declines, exit from unemployment increases, job separations diminish and job-to-job transitions increase. Increasing these arrival rates produce a general improvement in the Mexican labor market and accordingly higher retention rates in that country.

Our second exercise consists of another kind of labor market improvement in Mexico: a displacement of the wage offer distribution in Mexico. We increase the mean of log-wages to produce the same average wages in Mexico at age 45 generated by the previous exercise. This variation allows us to assess the migration response to economic growth in Mexico in a way that is comparable to the first experiment, which also increases wages, so that we can disentangle effects of wage increases from effects of arrival rates' increases. Column 2 in Table 4 shows that the increase in the Mexican wage offer distribution reduces the highest migration rate from 19% at age 25 to 7% at age 23. It also decreases the highest migration flow from 5% to 4%, while it increases the return migration flow from 22% to 51%. This exercise does reduce migration from Mexico to the US, but less than the previous exercise, which indicates the importance of job-to-job transitions for migration, once wage increases are accounted for.

[Figure 5 here]

Figure 5 shows the net migration rates, the Mexico-US flows and US-Mexico flows for all ages for the benchmark case, our exercise 1 and exercise 2. We can clearly see that the effect of imposing US arrival rates in Mexico is strikingly higher than the effect of increasing the mean wages in Mexico. This is generated by the fact that Mexico-US flows are sharply reduced and represent the lowest flows of the three cases depicted, and by the fact that return flows increase for all ages above 20 years

old. Notice that for very young individuals return migration rates go to zero simply because the migration flows are reduced to zero.

Our third and fourth exercise consists of a variation of migration and return migration costs and assessing their effect on migration from Mexico to the US. We double the costs of migrating from Mexico to the US, from \$882 to \$1764. Column 3 in Table 4 shows that this experiment reduces all migration moments that we consider in our simulation and that such reductions are substantially smaller than our discussed changes to arrival rates in Mexico. This exercise reduces the highest migration rate from 19% to 5%, reduces the highest migration flow from 5% to 2%, and increases the highest return migration flow from 22% to 38%. Notice that this reduction is substantial, but not as big as the first exercise.

The fourth exercise consists of giving a subsidy of 300 dollars for migrants to go home. Column 4 in Table 4 shows that this experiment reduces the highest migration rate from 19% to 14%, while increasing the highest migration flow from 5% to 6%, and increasing the highest return migration flow from 22% to 41%. We can see that this policy produces the lowest reduction in migration. The main reason is that this policy reduces migration of the old, but increases migration of young individuals.

[Figure 6 here]

Figure 6 compares the migration rate, the Mexico-US flow and the US-Mexico flow for the benchmark case, and the two migration costs variations exercises. These figures show clearly that compared to the increase in migration costs a subsidy to return migration is the worst policy if the objective is to reduce migration.

In sum, among the four exercises carried out here, the improvement in labor markets due to the use of the US arrival rate while employed in the Mexican labor market is the one that generates the largest reductions in migration rates. This reveals that migration from Mexico to the US is not only generated by higher wages but also

by faster job-to-job reallocations in the latter country. On the other hand, increasing migration costs is very effective in reducing migration from Mexico to the US.

7 Conclusions

We propose a model of job search, savings and migration that is able to replicate the main trends of the data. Marked differences in wage and job-to-job transitions persist between Mexico and the US, but job taking and job loss transitions tend to converge and become relatively better in Mexico. Accordingly, individuals choose to migrate when young to save in the US and return home at a mature age, when they are wealthier, labor market conditions improve in Mexico, and they can enjoy non-pecuniary benefits from living in their home country.

Our experiments on regime changes show that assigning Mexico the US arrival rates while employed results in a dramatic reduction in migration rates, practically to zero. This regime change is more powerful than a comparable increase in the Mexican wage offer distribution. Doubling migration costs does reduce migration substantially, but not as much as an increase in arrival rates while employed. Subsidizing return of Mexican migrants reduces migration of older cohorts, but increases migration of younger cohorts.

We interpret our results as indicative that Mexicans migrate not just attracted by higher wages but also by faster job mobility in the US.¹⁷ A more dynamic labor market in Mexico, i.e. one with faster job reallocations, would dramatically reduce migration to the US.

¹⁷There are few structurally estimated arrival rates, so it is hard to establish a clear trend over time for this parameter; however, there is evidence of a decline in job-to-job transitions in the US since 1984. See Fallick and Fleischman (2004) and Moscarini and Thomsson (2007). A matter of further research is to relate trends of US. job-to-job transitions to international migration to the US.

Appendix

A1. Proof of Proposition 1 and 2

Proof of Proposition 1: At age $t = T$, $V_t^e(A_t, \omega, k)$ is monotonically increasing in ω . This follows from the fact that the utility function is increasing in consumption and a higher ω increases consumption at time T . Then $W_T^e(A_T, \omega, k)$ defined in is also increasing in ω . Now, functions $V_t^e(A_t, \omega, k)$ and $W_t^e(A_t, \omega, k)$ at $t < T$ preserve monotonicity in ω . Thus the reservation wage property exists both for reservation and retention wages ■

Proof of Proposition 2: If $\pi_t^k < \lambda_t^k$, then $W_t^u(A_t, k) > W_t^e(A_t, \omega^*(A_t, k), k)$ and from the definition of retention wages we know that $W_t^e(A_t, \omega^{**}(A_t, k), k) = W_t^u(A_t - c^k, 1 - k)$.

Then $I_t^m(A_t, k) = 1$ is equivalent to $W_t^u(A_t - c^k, 1 - k) > W_t^u(A_t, k)$ and because of transitivity $W_t^e(A_t, \omega^{**}(A_t, k), k) = W_t^u(A_t - c^k, 1 - k) > W_t^u(A_t, k) > W_t^e(A_t, \omega^*(A_t, k), k)$. Hence $\omega_t^{**}(A_t, k_t) > \omega_t^*(A_t, k_t)$. Similarly, $\omega_t^*(A_t, k_t) > \omega_t^{**}(A_t, k_t)$ is equivalent to $W_t^e(A_t, \omega^*(A_t, k), k) > W_t^e(A_t, \omega^{**}(A_t, k), k)$ and because of transitivity $W_t^u(A_t, k) > W_t^e(A_t, \omega^*(A_t, k), k) > W_t^e(A_t, \omega^{**}(A_t, k), k) = W_t^u(A_t - c^k, 1 - k)$. Hence, $I_t^m(A_t, k) = 0$ ■

A2. Numerical Solution of the Model

As mentioned in the main body of the paper, the model is solved on a discretized state space. The table below gives further details of this discretization, based on Rendon (2006).

Discretization of variables		
	Assets	Wages
Original Variable	A	ω
Discretized Variable	$A(i)$	$\omega(j)$
Gridpoints	$i = 1, \dots, N_A$	$j = 1, \dots, N_w$
Number of Gridpoints	$N_A = 251$	$N_w = 51$
Lower Bound	$\underline{A} = 0$	$\underline{\omega} = 50$
Upper Bound	$\bar{A} = 150,000$	$\bar{\omega} = 20,000$
Gridsize	$\Delta_A = \frac{\bar{A} - \underline{A}}{N_A} = 598$	$\Delta_w = \frac{\ln \bar{\omega} - \ln \underline{\omega}}{N_w} = 392$

The discrete probability for a wage draw $\omega(j)$ is

$$\hat{f}(j, k) = \frac{\Phi\left(\frac{\ln \omega(j) + \Delta_w / 2 - \mu^k}{\sigma_w^k}\right) - \Phi\left(\frac{\ln \omega(j) - \Delta_w / 2 - \mu^k}{\sigma_w^k}\right)}{\Phi\left(\frac{\ln \bar{\omega} - \mu^k}{\sigma_w^k}\right) - \Phi\left(\frac{\ln \underline{\omega} - \mu^k}{\sigma_w^k}\right)}.$$

Wage as a function of age $w_t(\omega, k)$ is also discretized and becomes $w(j, k, t) = \omega(j) \exp(\alpha_1^k t + \alpha_2^k t^2)$. Arrival and layoff rates are $q(k, t) = \frac{\exp(\alpha_q^{0k} + \alpha_q^k t)}{1 + \exp(\alpha_q^{0k} + \alpha_q^k t)}$, $q = \{\lambda, \pi, \theta\}$.

The numerical solution proceeds in the following steps:

1. For $t = T + 1$ define the discretized value functions:

$$V^u[i, k, t] = V^R[i, k, t], \text{ and} \\ V^e[i, j, k, t] = V^R[i, k, t],$$

where $V^R [i, k, t]$ is the discretized value of being retired:

$$V^R [i, k, t] = \max_m \left\{ U \left(A_s(i) - \frac{A_{s+1}(m)}{1+r} \right) + (1-k) \psi + \beta V^R [i, k, t+1] \right\},$$

with $A_{T_F+1} = 0$.

2. Integration. Define the discretized expected values

$$\begin{aligned} W^u [i, k, t] &= \lambda(k, t) \sum_{j=1}^{N_w} \max [V^e [i, j, k, t], V^u [i, k, t]] f(j, k) + [1 - \lambda(k, t)] V^u [i, k, t]; \\ W^e [i, j, k, t] &= [1 - \theta(k, t)] \left(\pi(k, t) \sum_{l=1}^{N_w} \max [V^e [i, j, k, t], V^e [i, l, k, t], V^u [i, k, t]] f(l, k) \right. \\ &\quad \left. + [1 - \pi(k, t)] \max [V^e [i, j, k, t], V^u [i, k, t]] \right) \\ &\quad + \theta(k, t) \left(\pi(k, t) \sum_{l=1}^{N_w} \max [V^e [i, l, k, t], V^u [i, k, t]] f(l, k) \right. \\ &\quad \left. + [1 - \pi(k, t)] V^u [i, k, t] \right). \end{aligned}$$

3. Compute the value function for the previous period

$$\begin{aligned} V^u [i, k, t] &= \max_m \left\{ U \left(A(i) + b^k - \frac{A(m)}{(1+r)} \right) + (1-k) \psi \right. \\ &\quad \left. + \beta \max [W^u [m, k, t+1], W^u [h(m, k), 1-k, t+1]] \right\}, \\ V^e [i, j, k, t] &= \max_n \left\{ U \left(A(i) + w(j, k, t) - \frac{A(n)}{(1+r)} \right) + (1-k) \psi \right. \\ &\quad \left. + \beta \max [W^e [n, j, k, t+1], W^u [h(n, k), 1-k, t+1]] \right\}, \end{aligned}$$

where $h(m, k) = \{h \mid A(h) \geq A(m) - c^k > A(h-1)\}$. The maximizers to these problems are $m^* = m^*(i, k, t)$ and $n^* = n^*(i, j, k, t)$; and the reservation wage is $j^*(i, t) = \{j \mid V^e [i, j, k, t] \geq V^u [i, k, t] > V^e [i, j-1, k, t]\}$.

4. Go to step 2. This process goes backwards and it is repeated until reaching period $t = 1$.

A3. Sample Selection and Construction of Variables

The first data set used in this paper is the Mexican Migration Project 124; the files used in this paper are the longitudinal files, which include 17,764 individuals. After applying our selection criteria, only males 15 to 45 years old who are not disabled or incarcerated, our sample reduces to 9,225 individuals, as seen in Table A1.

The MMP 124 includes all individuals surveyed in the communities that reaches, which generates three types of observations: those who never migrate and provide their labor history in Mexico; those who migrate, return home, and provide their labor and migration history; and those who migrate, stay in the US, and have some family members in Mexico that provide part of their data. For these individuals, the MMP sends surveyors to the US and interviews those individuals to obtain their labor and migration histories. Consequently,

the MMP only loses individuals that belong to households that migrated entirely to the US or to another community in Mexico. The longitudinal files of MMP124 are constructed by interviewing individuals and asking them retrospective questions about their migratory history and entire job search history. They are also asked about their first and last wages in both Mexico and the US. The major disadvantage of the MMP124 data set is the potential measurement error due to recall bias, as well as the fact that over time changes are due not only to individual changes, but they are also due to changes in the communities sampled. Our measure of job to job transition can also miss unemployment spells that lasted less than a year.

The second data set is a 10% sample of the 2000 Mexican Census. Here we are using the files containing 4.9 million observations on Mexican males. Once we restrict attention to individuals 15 to 45 years old and exclude disabled people we are left with 1.7 million observations, as shown in Table A1.¹⁸ We obtain annual wage income multiplying by twelve the monthly income reported in the Mexican census and then dividing it by the PPP rate.

The third data set is a 5% sample of the US census (IPUMS data base), which has 234 thousand observations on individuals that claim to be born in Mexico. Once we restrict the sample to males 15 to 45 years old and exclude disabled individuals we are left with 134 thousand observations (see Table A1).

The fourth data set used in the paper is the ENEU 1999 first quarter to fourth quarter waves. ENEU is representative of urban Mexico. It includes a total of 495 thousand individuals. Once we restrict attention to males between 15 to 45 years old and exclude the disabled, we are left with 112 thousand individuals.¹⁹ To measure unemployment, we consider employed only those individuals that answered to have done paid work in the previous week. We also considered employed individuals if they were not present at work and they claim to have been temporarily ill, or in vacations. Every other individual is considered not employed, including those out of the labor force. The unemployment rate used in the paper is the proportion of observations that are unemployed in the sample by age. The proportion of individuals exiting unemployment is obtained as the proportion of individuals that exit unemployment from one quarter to another by age. Then we obtained the weighted average of this measure for the year. The proportion of individuals losing their jobs is obtained as the proportion of individuals that lost their job from one quarter to another, then we obtained the weighted average for this measure in the year. With this information we estimate the annual transition probabilities. The major advantage of this data set is that transitions between employment and non-employment are obtained quarter to quarter at the individual level. The major disadvantage of the data set is that it only represents the urban population of Mexico.

The fifth source of data is the CPS 1999 January to December waves. They are a representative data set of the US population. It provides also with a rotating panel on employment status, employment transitions and wages of individuals. We only include in the study individuals that claim they born in Mexico, which in total are 7.5 thousand individuals. The sample used in the study includes only males 15 to 45 years old, which are not disabled, which let us with 3.4 thousand individuals. Individuals are considered employed only if they answered to have done paid work in the previous week. They were also considered employed if they were not present at work and they claim to have been temporarily ill, or in vacations. Every other individual is considered not employed. The

¹⁸We also exclude in this sample all individuals that are interviewed by the census and that claim to work in the US.

¹⁹We also exclude individuals that left the rotating panel because they change address and the survey did not follow them. (i.e. "hogares mudados" in the data base).

unemployment rate is then calculated as the proportion of observations unemployed in the sample by age. The proportion of individuals exiting unemployment is obtained as the proportion of individuals that exit unemployment from one month to another by age. Then we obtained the weighted average of this measure for the year. The proportion of individuals losing their jobs is obtained as the proportion of individuals that lost their job from one month to another, then we obtained the weighted average for this measure in the year. With this information we estimate the annual transition probabilities. The major advantage of the CPS is that it provides with month to month transitions between employment and non-employment at the individual level. The major disadvantage is that the CPS potentially undercounts illegal Mexican migrants to the US.

Table A2 shows the number of periods that individuals appear in our different panels: the MMP124, ENEU, and the CPS. In MMP124 most observations are observed for more than 5 years. In ENEU, the individuals are distributed evenly among 2, 3 and 4 periods. In the CPS most observations are found 2 to 4 periods, while very few are observed for more than 5 periods.

A4. Choice of sources

In principle, we can get all the information we need for this paper from the MMP124 data set. However, a comparison with the Mexican Census, the US census, ENEU and CPS shows that the data for wages, employment, job loss and exit from unemployment look very different, as Table A3 illustrates.

Available wages in the MMP124 are the first wage in the US, the last wage in the US and the last wage in Mexico. Wages in the US are transformed into 1999 dollars using the consumer price index. They are first transformed into annual wage income depending on their periodicity. Wage that are reported for Mexico are first transformed into annual wages depending on their periodicity, then transformed into US dollars using the exchange rate in the given year, and, finally, transformed into 1999 dollars by the consumer price index. All the wages come from the life files in the data set.

For wages we use Census data for both countries. We did not use ENEU data set for wages in Mexico, because this source only contains urban data, and we wanted to have a picture for the average migrant. We calculate wages from the ENEU and compare them to the wages from the Mexican census. Wages for ENEU were obtained from the wages reported in the survey, which were either monthly, biweekly, weekly or daily. They were transformed to annual income. Then divided by 9.7, which was the average exchange rate in 1999.

We use US census wages and not those of the CPS, to be consistent with the choice of data for measuring wages for Mexico. Additionally, most of the research on migration from Mexico to the US. has used Census data. We compare wages for Mexicans measured in the CPS with wages measured in the US census. Wages for CPS were obtained from the weekly income reported in the survey and then multiplied by 52. In general wages in the US census are smaller than wages in the CPS. Wage information from the MMP124 is very noisy, which could be related to recall bias, since these data are retrospective.

For employment rates and employment we can use the data from MMP124 life data set on occupations reported by the individuals. This is retrospective information on the employment history of the individuals. However, we observed that unemployment rates were smaller than expected which is due to the fact that the MMP124 is an annual data set, in which short spells of unemployment may be not reported. Thus, we prefer to use the employment surveys for Mexico and the US, ENEU and CPS.

A5. Comparison with other sources

Our estimations of the migration rate are comparable to those of Chiquiar and Hanson (2005: 246). They show that the migration rate in 2000 for males Mexicans 16 to 25 years old was 17.58, which is above the MMP124 migration rate of 11%. For males 26 to 35 years old they estimate the migration rate at 15.49, which is below the MMP124 migration rate of 16%. Finally, for males 36 to 45 years old they estimate a migration rate of 12.21%, while the MMP124 migration rate is 14%. Our estimations of the unemployment rate seem higher to what has been reported in the literature, because we are including as unemployed individuals out of the labor force. Once we take into account this difference our numbers are comparable to those in the literature. Blau and Kahn (2007) report an unemployment rate for males in the US of 13%, and that 6% of Mexican males in the US are out of the labor force. Their estimations are based on the CPS 1994-2003 March waves. We report an unemployment rate of 19%, but this number includes individuals who are both unemployed and out of the labor force. We merge these categories to simplify our analysis.

Our estimations of probabilities of exit from unemployment and job loss probabilities are comparable to those shown by Calderon-Madrid (2000), once we take into account differences in sample and frequency reported. He shows that job loss in a given quarter of 1997 was 10.91%, among males and females between 14 and 77 years old in Mexico, while the exit rate from unemployment was 12.31%. In annual terms, job loss amounts to 30.66% and exit from unemployment to 34.59%. Our reported job loss is smaller and our exit from unemployment higher because we look at males 15 to 45 years old. If we use Calderon-Madrid (2000) sample selection rules for 1999 the job loss is equal to 33.73%, while exit from unemployment is 46.66% for 1999.

Card and Lewis (2007) show that the mean hourly wage for Mexicans in the 2000 US census was 12.89 dollars per hour for males 16 to 45 years old. Using our sample, which is different from their sample in that we exclude disabled individuals, generates an average annual wage income of \$16,816 for that year. If individuals worked 52 weeks and 40 hours per week, that annual wage income is equivalent to approximately 8.08 dollars per hour. We believe this implies that leisure choices are potentially important, since it is obvious that individuals must be working less than full time shifts. However, and in-depth analysis is beyond the scope of this paper and is left for future research.

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Table 3: Goodness of fit tests: χ^2 and R^2

Country Variable	Statistic	Mexico	United States
Migration rate	χ^2		0.94903
Migration flows (from)	χ^2	3.80437	0.53572
Annual Wage	R^2	0.99999	0.99999
Annual Log wage	R^2	0.99997	0.99996
Standard Deviation	R^2	0.92861	0.93537
Unemployment rate	χ^2	5.43126	17.40138
Exit from Unemployment	χ^2	1.17181	1.43517
Job loss	χ^2	11.21381	11.50379
Job-to-Job Transitions	χ^2	3.21841	1.05311

Note. Critical values are: $\chi^2_{(29)} = 42.5570$, at 5% and $\chi^2_{(29)} = 52.3356$, at 0.5% significance level.

Table 4: Regime Changes:

Variable		Base	Counterfactuals:			
			Labor Mkts in Mx		Migration Costs	
			Arrival rates: US π_t^e in Mx.	Higher W. Offer $\mu =$ 7.17757	Double Cost from Mx-US	Subsidy Cost from US-Mx
		(0)	(1)	(2)	(3)	(4)
Migration						
Highest migration rate		18.78	0.47	7.43	4.82	14.38
Age at highest migration rate		25	35	23	26	23
Migration rate at 15		0.91	0.00	0.81	0.00	2.08
Migration rate at 45		10.98	0.34	1.97	2.43	7.14
Highest migration flow		4.94	0.30	4.06	1.76	5.85
Age at highest migration flow		23	29	21	26	21
Highest return migration flow		22.39	85.71	50.64	37.77	40.92
Age at highest return migration flow		17	26	27	20	17
Average duration of migration		11.49	3.42	3.92	8.00	7.53
Average No of times in the US		1.67	1.04	1.58	1.22	1.71
% never emigrates		60.14	97.75	61.99	88.06	55.48
% migrates one time		23.59	2.15	24.74	9.92	26.30
% migrates two times		9.89	0.09	8.15	1.57	10.59
% migrates three times		3.91	0.02	3.00	0.33	4.26
Aver. Duration of 1st migration		12.44	3.47	3.91	8.12	7.16
Aver. Duration of 2nd migration		10.87	2.49	3.90	8.01	8.13
Aver. Duration of 3rd migration		9.69	1.00	3.88	5.73	8.44
Wages at age 45						
Average Wages	Mex	5598	7871	7871	5465	5567
	US	20905	21463	24285	21625	21144
Average LogWages	Mex	7.8363	8.2354	8.2114	7.8032	7.8301
	US	9.3398	9.3054	9.4974	9.4005	9.3576
St. Dev LogWages	Mex	0.8127	0.7504	0.7993	0.8223	0.8128
	US	0.6903	0.7638	0.7217	0.6553	0.6840
Employment rates at age 45 (in %)						
Unemployment Rate	Mex	1.31	0.42	1.08	0.66	0.96
	US	4.95	2.34	4.07	5.35	5.18
Exit from Unemp.	Mex	55.43	84.93	52.40	72.35	66.04
	US	82.09	0.00	0.00	94.12	82.60
Job Separations	Mex	0.37	0.33	0.38	0.37	0.36
	US	4.84	2.63	4.45	5.47	5.15
Job-to-job flows	Mex	1.80	3.42	1.84	1.95	1.84
	US	11.34	7.27	5.78	9.45	9.51

Table A1: Sample Selection (Individuals)

	MMP	Mex. Census	US Census	ENEU	CPS
All	17,764	4,938,130	234,159	234,423	7,477
15 to 45	9,245	2,263,840	172,778	164,286	5,603
Excluding disabled	9,225	1,693,627	133,977	157,463	5,570
Individuals with 2+ periods	9,225	–	–	112,649	3,402

Table A2: Balance of the Panels (Individuals)

Variable	Data set		
	MMP	ENEU	CPS
Periodicity	Annual	Quarterly	Monthly
N	9225	112,649	3,402
Periods	%	%	%
2	0.00	25.88	23.07
3	0.00	26.68	20.43
4	0.02	47.44	54.85
5+	99.98	–	1.65

Table A3: Descriptive Statistics. Choice of Sources

Country	Source	Mexico			Source	United States		
		Age	Age	Age		Age	Age	Age
Variable		16-25	26-35	36-45		16-25	26-35	36-45
Annual Log wage (dollars)	Census	7.69	8.11	8.20	Census	9.09	9.74	9.87
Standard Deviation	Census	0.64	0.79	0.89	Census	0.92	0.76	0.82
Annual Log wage (dollars)	ENEU	9.04	9.51	9.55	CPS	9.46	9.86	9.96
Standard Deviation	ENEU	0.75	0.75	0.95	CPS	0.52	0.48	0.47
Annual Log wage (dollars)	MMP	6.63	7.18	7.24	MMP	10.01	9.90	9.91
Standard Deviation	MMP	3.05	2.82	2.76	MMP	0.38	0.38	0.43
Unemployment rate (%)	ENEU	34.85	4.43	3.72	CPS	26.49	6.69	9.82
Exit from Unemployment (%)	ENEU	60.17	95.04	94.81	CPS	74.70	92.95	85.89
Job loss (%)	ENEU	29.67	3.73	3.31	CPS	22.08	6.42	8.74
Unemployment rate (%)	MMP	1.63	0.65	1.11	MMP	1.12	0.36	0.62
Exit from Unemployment (%)	MMP	19.83	18.28	7.58	MMP	27.45	36.06	23.16
Job loss (%)	MMP	0.20	0.10	0.15	MMP	0.13	0.07	0.20

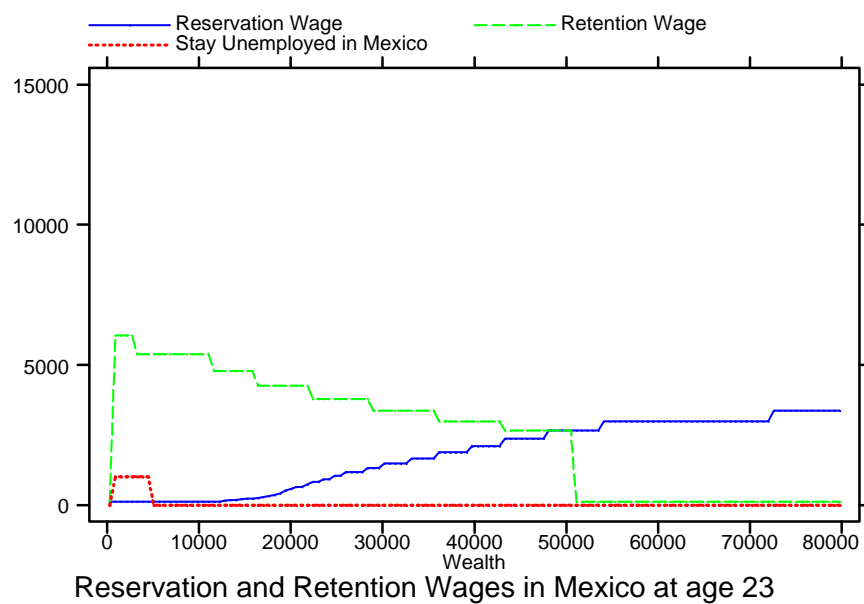


Figure 1: Mexico: $\omega_{11}^*(A, 0)$ and $\omega_{11}^{**}(A, 0)$, and rescaled Indicator function $I_{11}^m(A, 0)$.

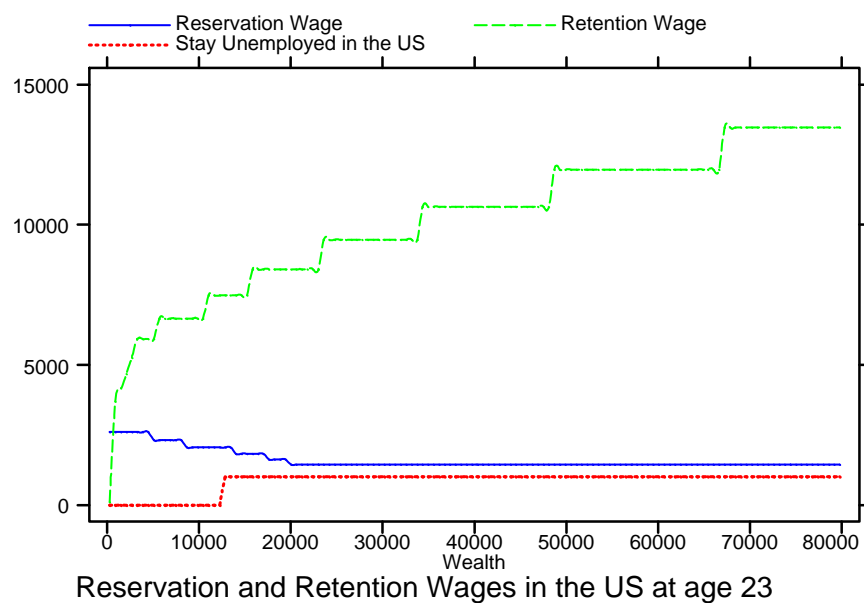


Figure 2: USA: $\omega_{11}^*(A, 1)$ and $\omega_{11}^{**}(A, 1)$, and rescaled Indicator function $I_{11}^m(A, 1)$

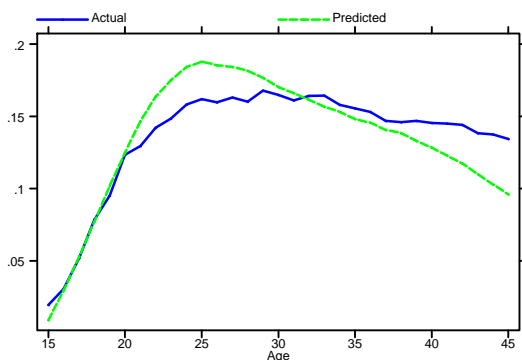


Figure 3a: Mexico Migration Rates

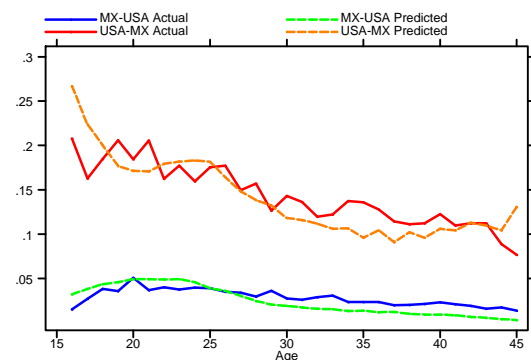


Figure 3b: Migration Flows

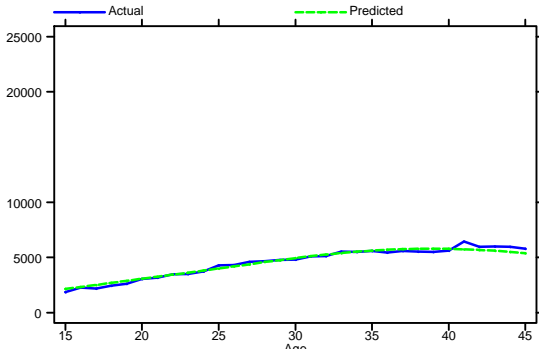


Figure 3c: Mexico. Wages

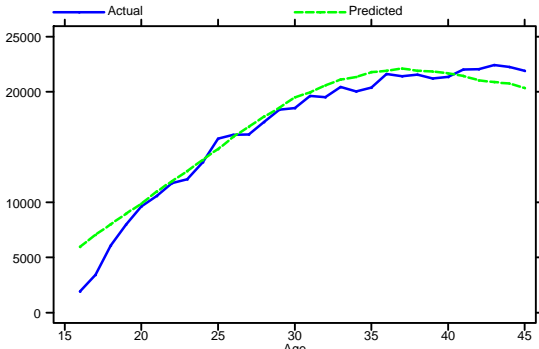


Figure 3d: USA. Wages

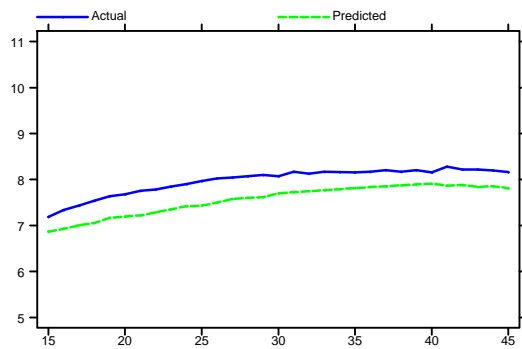


Figure 3e: Mexico. Log-Wages

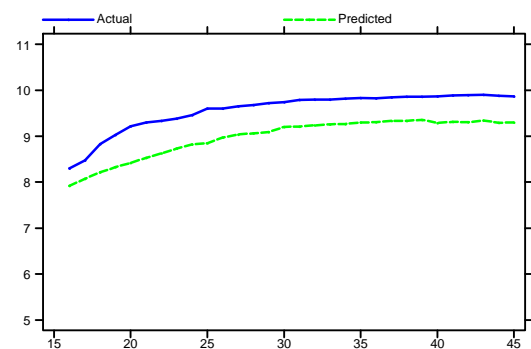


Figure 3f: USA. Log-Wages

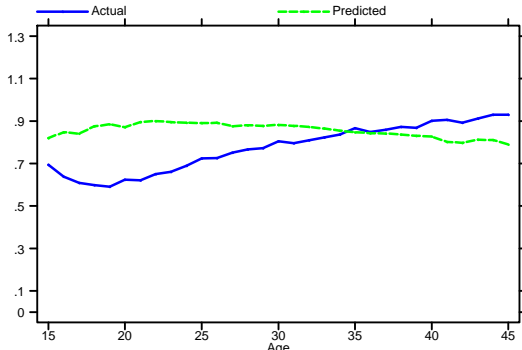


Figure 3g: Mexico. Standard Deviation of Log-Wages

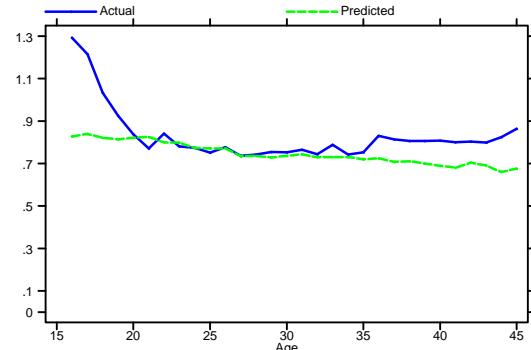


Figure 3h: USA. Standard Deviation of Log-Wages

Figure 3: Actual and Predicted Migration Rates and Wages

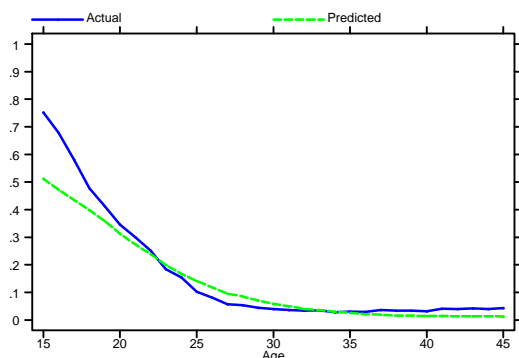


Figure 4a: Mexico. Unemployment Rates

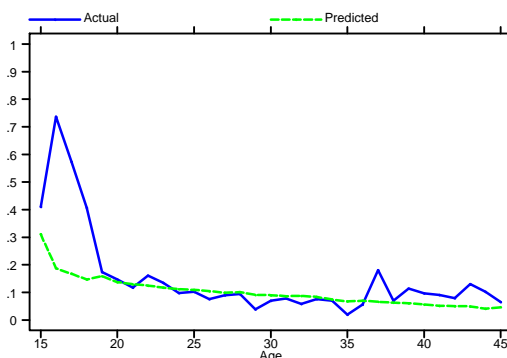


Figure 4b: USA. Unemployment Rates

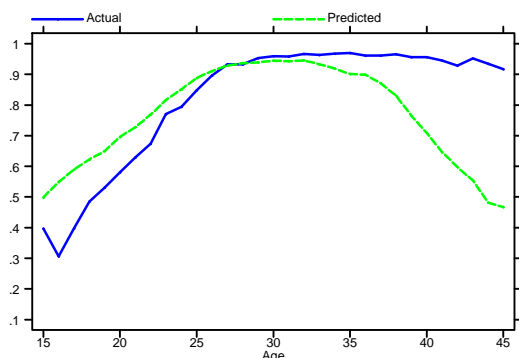


Figure 4c: Mexico. Exit from Unemployment

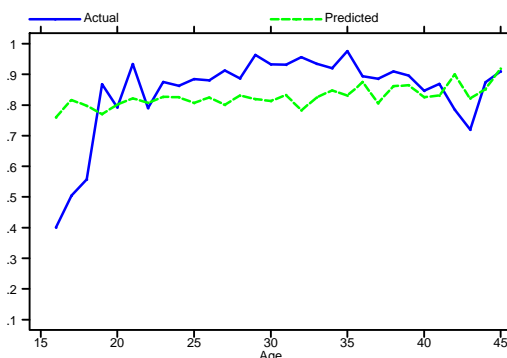


Figure 4d: USA. Exit from Unemployment

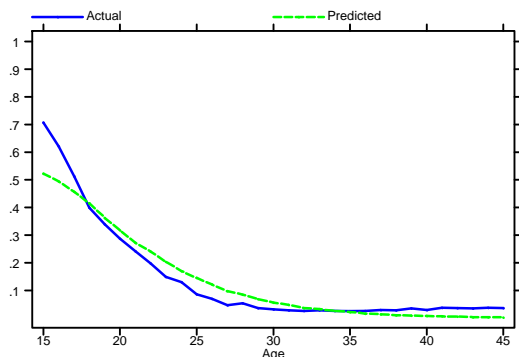


Figure 4e: Mexico. Job Loss

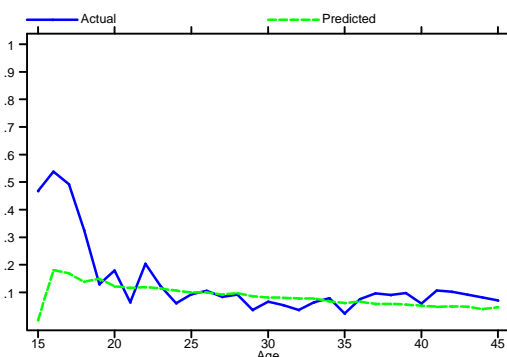


Figure 4f: USA. Job Loss

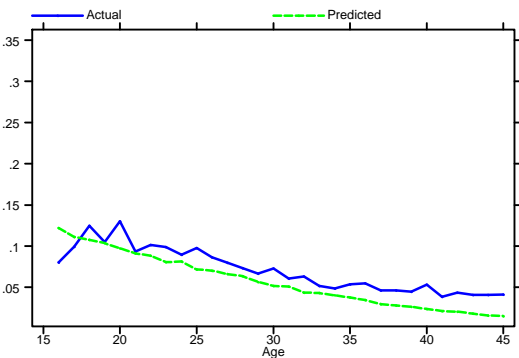


Figure 4g: Mexico. Job-to-Job Transitions

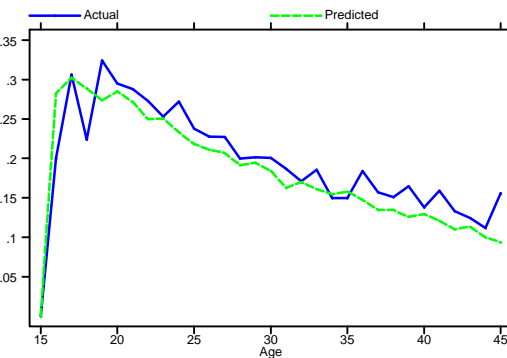


Figure 4h: USA. Job-to-Job Transitions

Figure 4: Actual and Predicted: Employment Status and Employment Transitions

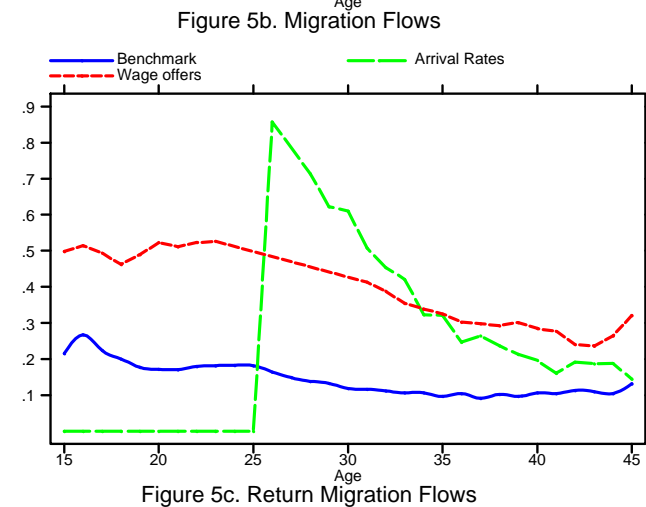
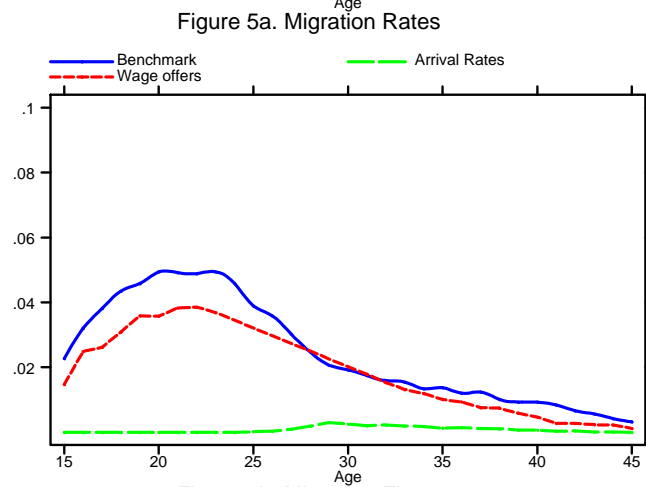
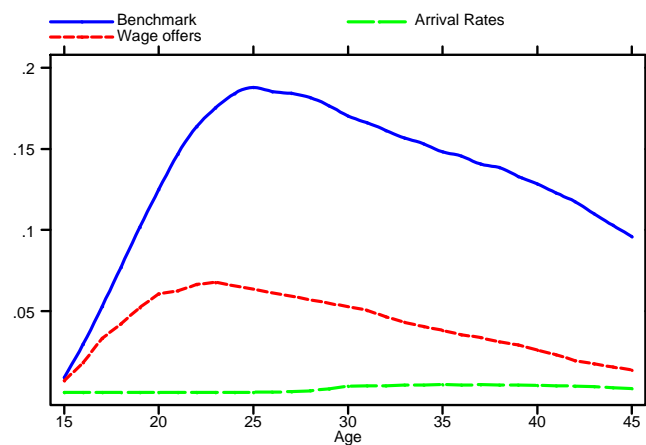


Figure 5: Regime Changes: Labor Market Improvements in Mexico

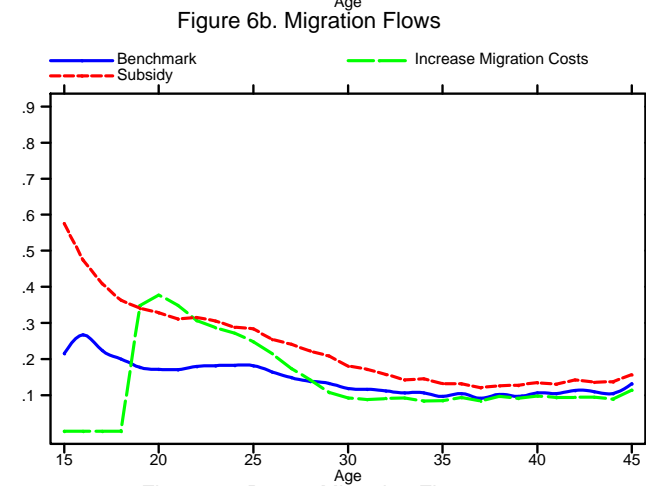
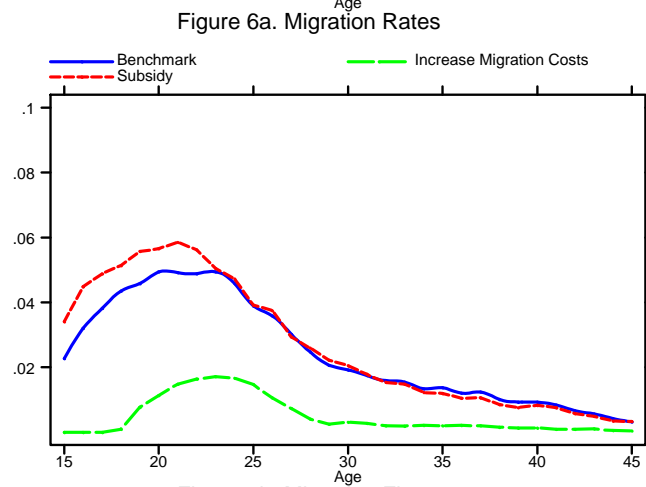
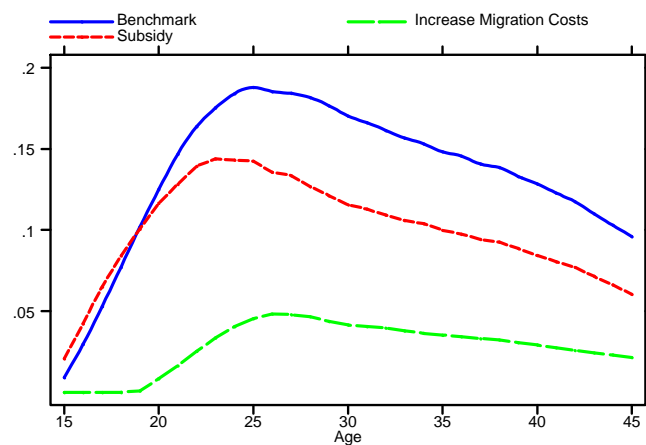


Figure 6: Regime Changes: Migration Costs Variations