

Extreme Weather Events and Migration: The Case of Morocco

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World Bank

June 2014

Online at https://mpra.ub.uni-muenchen.de/56938/MPRA Paper No. 56938, posted 29 Jun 2014 13:46 UTC

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This paper is forthcoming in:

Wodon, Q., A. Liverani, G. Joseph and N. Bougnoux, 2014 editors, *Climate Change and Migration:*Evidence from the Middle East and North Africa, Washington, DC: The World Bank.

Abstract

Do extreme weather events such as droughts or floods lead to migration away from the areas affected by these events? This chapter aims to provide an answer to that question for Morocco using a new nationally representative household survey implemented in 2009-10. The data suggest that around one in four households have been affected by weather shocks in the five years preceding the survey implementation. Droughts and floods are not directly identified by households as major reasons for migration, but insufficient agricultural revenue and a lack of agricultural employment as well as better employment opportunities at the place of destination are mentioned as reasons to migrate, and these are affected by adverse weather shocks. Furthermore, in regression analysis, after controlling for a wide range of individual and household characteristics, the probability of both temporary and permanent migration increases if the household has been affected by an adverse weather shock or the consequences thereof. Thus, while adverse weather events may not be the main driver of migration, they do contribute to it.

1. Introduction

The frequency of droughts has increased in Morocco over the last few decades, with negative impact on farmers and the economy as a whole (Azzam and Sekkat, 2005; Barakat and Handoufe, 1998; Skees, 2001). Most agricultural land is not irrigated, which means that affected households often have limited ways to reduce the impact of droughts on their livelihood (Skees, 2001; Swearingen and Bencherifa, 2000). In chapter 6 of this study, a recent national household survey for Morocco was used to document the extent to which Moroccan households, and especially those involved in agriculture, are confronted with extreme weather events such as droughts. The analysis suggested that most households working in agriculture were affected by weather shocks, often seriously. In the population as a whole, the proportion of households affected was about one fourth, simply because households not in agriculture were not likely to be affected. Many households affected declared not being able to recover from these shocks.

Given the high level of vulnerability of households to weather shocks and their limited means to cope with the shocks and adapt to climate change, one might expect that weather shocks would contribute to out-migration in the affected areas. It would make sense that some household members would leave the areas most affected by drought, and there is indeed some evidence to this effect. After a severe drought in 2007, two thirds of the illegal migrants arrested in Spain were from the farming and mining region of Khouribga (EACH-FOR, 2008). Another study by Hamza, El Faskaoui and Fermin (2009) found that environmental degradation was one of the reasons leading to past or intended migration. Yet these studies have been fairly localized and based on small samples, so that it is difficult to generalize from them – for example the study by Hamza, El Faskaoui and Fermin has a sample size of 30, so that it is unclear at the national level whether climate shocks are a major or relatively small factor affecting migration.

The objective of this chapter is to test whether these weather shocks indeed contribute to migration, both temporary and permanent, by using a broader sample (for a brief review of the literature which informs this chapter, see the introduction of chapter 2 by Wodon et al. (2014) and chapter 3 on the focus countries for this work by Burger et al. (2014a) in this study. The analysis is based on a nationally representative household survey—the Morocco Household and Youth Survey (MHYS) implemented between December 2009 and March 2010. Much of the questionnaire of that survey focuses on issues critical to youth, such as the obstacles they encounter on the labor market and for civic participation. But the questionnaire also included data on migration as well as on various shocks affecting households and their ability to cope with these shocks. One of the shocks is that of adverse weather events (such as droughts and floods). It is thus feasible using econometric techniques to assess whether households who were affected by extreme weather events experienced higher migration rates among their members after controlling for a range of other household and individual characteristics.

The chapter is organized as follows. Section 2 introduces the data used for the analysis. Section 3 provides basic statistics on the extent to which households are affected by weather and other shocks, and on the extent of both temporary and permanent migration among household members. Section 4 then provides the multivariate analysis of the correlates of temporary and permanent migration among household members. A brief conclusion follows.

2. Data

As was the case for chapter 6 of this study, this chapter is based on data from the Morocco Household and Youth Survey (MHYS) implemented in 2009–2010. The survey is nationally representative (even if it does not include the scarcely populated Western Sahara southern part of the country) and it includes data on 2,000 households (1,216 in urban areas and

784 in rural areas). The survey was implemented with funding from the World Bank between December 2009 and March 2010. Much of the questionnaire focused on issues critical to youth, and especially the obstacles that they encounter on the labor market and for civic participation. Questions were also asked about young people's intentions to emigrate. Other more traditional modules deal with standard questions on household member demographics and education as well as employment information. The questionnaire also focused on various shocks affecting households and their ability to cope with these shocks, including weather shocks. In order to be able to use the survey for this work on migration in the MENA region, additional questions as well as more options within existing questions were added to the questionnaire on household perceptions regarding changes in climate, and whether this affected migration decisions.

Apart from a range of household and individual characteristics which are used as controls in the regression analysis, a few central questions are used for the analysis presented in this chapter. In section 6A about the incidence of shocks and household responses, households are asked whether since November 2004, the respondent or a member of the household experienced various shocks. The shocks listed are: (1) Weather shocks (Droughts; floods; Pest infestation, crop and livestock diseases); (2) Unexpected increase in prices of food or other essential commodities consumed; (3) Unexpected loss of job; (4) Involuntary reduction in employment or the number of hours worked; (5) Unexpected decline in prices or demand for products that you sell; (6) Unexpected increase in prices or shortages of inputs or products needed for your activity; (7) Loss of asset or of livestock due to theft, death, or accident; (8) Cut-off or decrease in remittances to household; (9) Death of main earner for the household; (10) Death of another member of the family; (11) Serious injury or illness that kept any member from doing normal activities; (12) Divorce or abandonment by husband; (13) Big amount of dowry for daughter's marriage; (14) Other (specify). This is the information used in the regression analysis to assess the impact of weather shocks on migration controlling for a range of other independent variables.

Data on migration is available for all household members, both those who remain today members of the households, and those who used to be members but have left permanently. We can thus measure both temporary and permanent migration by household members. On the other hand, we only record the migration of household members, as opposed to that of whole households, but this should not be too much of a problem given that most migration is typically undertaken by household members, instead of entire households. It must also be recognized that it is difficult to distinguish the separate effects of climate change, environmental change, and weather shocks on households, and to separate short-term versus long-term household responses. What the questionnaire provides us with is information on whether households declare having been affected by a weather shock – but the decision to migrate is probably based on repeated shocks or changing conditions, as opposed to a single shock, and we cannot verify to what extent the declarations of households correspond closely to actual weather data for their area. But on the other hand one could argue that decisions such as that of migrating are influenced at least as much by perceptions of households of weather patterns as by the weather patterns themselves.

While all households respond to the question of whether they suffered from a weather shocks, in a separate part of the questionnaire households working in agriculture are asked whether they were faced with a number problems in the last five years. The list of problems identified was as follows: (1) Reduction in agricultural yields due to inadequate rainfall (periodic and recurrent water scarcity due to droughts); (2) Reduction in agricultural yields due to too much water (too much rain or flooding); (3) Poor soil quality due to erosion reducing agricultural yields; (4) Changing and unpredictable climate and temperatures reducing agricultural yields (i.e. too hot, too cold, too rainy, too dry); (5) Pest or locust infestation reducing agricultural yields;

(6) Reduced job opportunities in the agricultural sector; (7) Death of livestock due to bad weather conditions; (8) Reduction in the stock of livestock since the availability of grazing land is becoming less due to droughts and floods. Next households were asked: "How serious was the financial loss to the household due to these climate related factors listed above?" The potential answers were very serious, moderate, serious, and negligible. Finally households were asked "Was (the household) forced to change the economic activity after the shock?" This information will also be used in the regression analysis as some problems encountered by agricultural households – who tend to be more exposed to climate shocks – may lead to migration and the problems identified in the questionnaire may potentially better capture changes in structural environmental conditions than a weather shock would.

3. Basic Statistics

Table 1 provides summary statistics on the main variables of interest. The first two columns of the table give the migration rates observed for the various groups of households or individuals. The last two tables provide the summary statistics for the same variables as they are used in the regression analysis – note that in a number of cases the summary statistics are missing and replaced by the symbol "-" because these are the excluded reference categories in the regressions (the shares of those with that dummy variable can be readily computed from the other shares for the corresponding category of variables). In what follows, we focus the discussion of the basic statistics on the migration rates, while the summary statistics are provided simply for the sake of completeness in information and standard practice.

The temporary migration rate is at 5.71 percent for the sample as a whole, and is a bit higher than the permanent migration rate, at 4.00 percent. The temporary migration rate is at its highest level among individuals aged 25 to 34, while for permanent migration, the rate is highest among those aged 15 to 24. The older an individual gets, the less likely it is that s/he will migrate. Migration rates are much higher for women than for men, and this is confirmed when looking at the position of the individual in terms of being a head of household or a spouse (rates for spouses are much higher), or at the interaction effects between gender and marital status.

Table 1: Summary Statistics on Individual Level Migration Rates (%)

Table 1: Summary Statistics on	Migration rates Summary Statistics on Individual Level Migration Rates (%) Migration rates				
-	Temporary Permanent		Temporary	Permanent	
	migration	migration	migration	migration	
	rates	rates	regression	regression	
	(%)	(%)	regression	regression	
All comple	5.71	4.00	5.71	4.00	
All sample	3.71	4.00	3.71	4.00	
Age group	3.80	6.02	0.295	0.315	
Age 15 to 24			0.295	0.221	
Age 25 to 34 Age 35 to 44	7.23 6.63	5.87 2.31	0.213	0.221	
Č	5.76				
Age 45 to 54		0.66 0.88	0.152	0.142	
Age 55 and over	6.16		-	0.503	
Female Mala	9.65	6.34	0.505		
Male	1.83	1.63	- 0.252	0.225	
Spouse	7.00	4.97	0.252	0.235	
Head	1.85	0.70	-	-	
Education	4.51	2.24			
No Education	4.51	2.34	- 0.241	-	
Primary	7.34	4.69	0.241	0.244	
College	5.96	4.31	0.166	0.167	
Secondary	4.34	5.30	0.126	0.129	
Tertiary and up	9.84	8.03	0.052	0.056	
Married	5.06	0.00	0.588	0.588	
Not married	6.16	0.00	-	-	
Female*Married	7.51	0.00	0.324	0.324	
Not Female and Married	1.92	0.00	-	-	
Head age	-	-	55.166	55.309	
Head age squared	-	-	3219.087	3232.687	
Female Head	5.97	3.62	0.169	0.172	
Male head	4.35	5.69	-	-	
Head Married	4.06	4.19	0.986	0.986	
Head not married	5.75	3.96	=	-	
Head Education	7 02	0.00			
No Education	5.83	0.00	-	-	
Primary	5.30	3.75	0.230	0.232	
College	4.39	5.43	0.068	0.068	
Secondary	4.46	3.45	0.063	0.061	
Tertiary and up	10.62	5.91	0.029	0.029	
Head Occupation	7.2 0	0.00			
No Work	5.39	0.00	-	-	
Work for other	5.78	3.19	0.300	0.296	
Agricultural work	7.07	4.92	0.174	0.179	
Non-agricultural work	4.32	2.69	0.132	0.129	
Self-produce work	9.04	6.05	0.004	0.004	
Own more than 1 acre	5.04	3.45	0.242	0.248	
Own less than 1 acre	7.91	5.63	-	-	
Urban	7.93	4.47	0.596	0.589	
Rural	4.28	3.64	- 2010 / 15 1	-	

Source: Authors' calculations based on Morocco Household and Youth Survey 2010 (age 15 and older).

Number of observations: 7884 for temporary migration, 8502 for permanent migration.

Table 1 (cont.): Summary Statistics on Individual Level Migration Rates (%)

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	Temporary	Permanent	Temporary	Permanent	
	migration	migration	migration	migration	
	rates	rates	regression	regression	
	(%)	(%)	regression	10510331011	
Wealth index	(10)	(/c)			
Q1	9.58	4.97	_	_	
Q2	6.85	3.45	0.200	0.200	
Q3	4.31	3.52	0.207	0.205	
Q4	3.17	3.34	0.213	0.210	
Q5	4.95	4.68	0.175	0.175	
Regions	1.55	1.00	0.175	0.175	
Guélmim-Es Semara	2.73	5.15	0.024	0.024	
Souss-Massa-Draâ	12.56	5.68	0.106	0.107	
Gharb-Cherarda-Béni Hssen	6.65	2.65	0.071	0.069	
Chaouia-Ouardigha	6.79	4.23	0.078	0.079	
Marrakech-Tensift-Al Haouz	8.99	2.54	0.114	0.114	
Oriental	1.08	1.47	0.058	0.056	
Grand-Casablanca	2.28	3.44	0.131	0.130	
Rabat-Salé-Zemmour-Zaér	4.47	3.69	0.068	0.067	
Doukala-Abda	7.06	4.13	0.061	0.061	
Tadla-Azilal	5.52	7.67	0.061	0.064	
Méknès-Tafilalet	3.54	7.12	0.062	0.063	
Fès-Boulemane	1.81	1.98	0.045	0.045	
Taza-Al Hoceima-Taounate	7.83	3.00	0.078	0.078	
Tanger-Tétouan	1.47	3.09	-	-	
Economic and climate shocks	1.17	3.07			
Weather shocks (droughts, floods, etc.)	4.82	3.79	0.248	0.252	
No Weather shocks (droughts, floods, etc.)	8.53	4.52	-	-	
Unexpected increase in prices of food/other	5.01	4.10	0.735	0.736	
No Unexpected increase in prices	5.96	3.92	-	-	
Job related shocks	5.26	4.13	0.249	0.249	
No Job related shocks	7.04	3.48	-	-	
Cut-off or decrease in remittances	5.62	3.80	0.015	0.017	
No Cut-off or decrease in remittances	11.65	14.21	-	-	
Death/sick of HH member (incl. main earner)	5.51	3.81	0.117	0.119	
No Death/sick of HH member (incl. main earner)	7.19	5.21	-	-	
Climate change and shock in agriculture	7.127	5.21			
Reduction in agricultural yield due to less water	4.85	3.46	0.236	0.243	
No Reduction in agricultural yield due to less water	8.58	5.63	-	-	
Reduction in agricultural yield due to more water	5.54	3.70	0.169	0.173	
No Reduction in agricultural yield due to more water	6.56	5.32	-	-	
Reduced job opportunities in the agricultural sector	5.15	3.98	0.149	0.150	
No Reduced job opportunities in the agricultural sector	8.97	3.89	-	-	
Serious financial loss due to climate related factors	5.50	4.06	0.092	0.092	
No Serious financial loss due to climate related factors	7.79	3.09	-	-	
Change the economic activity after the shock	5.39	3.84	0.056	0.058	
No Change the economic activity after the shock	10.87	5.93	-	-	
Source: Authors' calculations based on Morocco Household and Youth Survey 2010 (age 15 and older)					

Source: Authors' calculations based on Morocco Household and Youth Survey 2010 (age 15 and older).

Number of observations: 7884 for temporary migration, 8502 for permanent migration.

In general, and especially in the case of permanent migration, migration rates are higher among the better educated. This is observed whether one looks at the education level of the individuals, or at that of the household heads. Migration rates also tend to be higher among households whose heads is self-employed, which would include small business owners. There are also higher among individuals belonging to a household with little hand, possibly because there is less pressure to stay at the place of origin in order to work the land. Temporary migration is especially high among poorer households as measured through an index of wealth, while permanent migration is slightly higher among both the bottom and the top quintiles.

Migration rates are higher among household located in urban areas, which may indicate substantial migration from smaller to larger areas as well as international migration from urban centers. There are also large differences in migration rates depending of the regions where households live. The highest temporary migration rate is observed in Souss-Massa-Draâ, followed by Marrakech-Tensift-Al Haouz, Taza-Al Hoceima-Taounate, Doukala-Abda, Chaouia-Ouardigha, and Gharb-Cherarda-Béni Hssen. For permanent migration, the highest rates are observed from Tadla-Azilal, Méknès-Tafilalet, Souss-Massa-Draâ, and Guélmim-Es Semara.

When looking at migration rates according to whether households have been exposed to weather and other types of shocks, it is remarkable to note that migration rates are essentially always higher among households who were not affected by negative shocks. This does not mean that shocks, including weather shocks, may not be correlated with migration in a multivariate setting, but it does suggest that overall, in the country as a whole, much of the migration that is taking place may not be primarily related to weather shocks.

A similar message emerges from the data provided in table 2 on the reasons declared by households for the migration of household members. For temporary migration, the main motivation by far is the fact that better offers of agriculture employment are available at the place of destination – this is the rationale for half of all temporary migrants. The same reason is mentioned for permanent migration, although in that case marriage is mentioned more often. The lack of jobs at the place of origin is mentioned, and it could be related to adverse weather conditions. It could also be that the availability of better agricultural employment at the place of destination is related to the effect of climate change and droughts at the place of origin. But this cannot simply be assumed given that being a victim of a drought or a flood is explicitly listed among the potential reasons to migrate in the questionnaire, and that very few households declare that these were the main reasons for the migration decisions of their members.

Table 2: Reasons for Migration by Household Members, Morocco 2009-10 (%)

	Temporary	Permanent
	migration	migration
Migration with the rest of the household	6.97	1.21
Better business opportunities in the new place	3.70	2.57
Low offer of jobs in the non-agriculture in place of origin	9.57	4.53
Change of profession	6.25	2.94
Studies of the person	6.27	4.91
Better infrastructure	0.00	0.48
Family reunification, join the large family	6.53	3.16
Marriage	0.71	44.67
Divorce separation	0.20	1.29
Victim of flood	0.12	0.00
Victim of drought	0.53	0.40
Victim of another environmental cause	0.20	0.00
Insufficient agricultural revenue or low agricultural employment	5.31	1.09
Better offers of agriculture employment in the new place	49.37	27.45
Other	4.27	5.31
Total	100	100

Source: Authors.

4. Correlates of the Probability of Migration

The basic statistics presented in the previous section appear to suggest that migration rates are lower in areas affected by extreme weather shocks. This does not mean however that weather shocks have a negative impact on migration. For example, a positive association was found between education and the likelihood of migration. If migration is lower among households affected by weather and other shocks, this might simply reflect the fact that these households tend to live in rural areas, work in agriculture, and be less well educated. Controlling for education, it could very well be that weather shocks could have a positive effect on migration. In order to assess the marginal impact of weather and other shocks on migration after controlling for a range of individual and household characteristics, this section provides a regression analysis of the likelihood of temporary and permanent migration in a multivariate setting. The analysis is still descriptive, but it enables us to assess whether controlling for individual and household characteristics as well as broad levels of geographic location, adverse weather shocks have a statistically significant effect on migration, whether positive or negative.

Table 3 provides the results of probit regressions (with robust standard errors) for the correlates of the probability of migrating either temporarily or permanently. Note that in the case of permanent migration, only migration for reasons not related to marriage is considered. Two different specifications for the model are provided – the second specification includes a series of additional household level variables which are not included in the first because of the risk of endogeneity with those variables in that, for example, migration may affect who is considered as the household head, or the education level of the household head. This risk of endogeneity is much larger in the case of permanent migration, but for comparison purposes the two models are estimated for both regressions. Marginal effects are provided (dF/dX), so that a value of 0.02 would represent an increase in the likelihood of migration of two percentage points.

The main variables of interest are at the bottom of table 3, and we start the discussion with those. Being subject to an adverse weather shock appears to increase the probability of temporary migration depending on the specification, but not the probability of permanent migration. It looks like household members are coping with weather shocks (which might be one-time events) by looking for work elsewhere, but that these conditions do not yet lead to

permanent departures. However, a reduction in agricultural yields due to less water increases permanent migration, suggesting that when the changes in environmental conditions are perceived to be more permanent, some household members do feel the need to migrate permanently. By contrast, a reduction in agricultural yields due to excess water (probably through floods) reduces the likelihood of migrating temporarily, possibly because the shocks may reduce the resources available to household members to migrate, and such shocks are not as likely to be perceived as permanent changes in conditions that affect long-term livelihood.

Unexpected increases in prices of food and others basic commodities also lead to more temporary migration, but the effect is only marginally significant in one of the two specifications, so one could argue that there is no clear effect. Finally, the largest effect on both temporary and permanent migration comes from being affected by a cut-off or decrease in remittances from previous household members who had migrated. This decrease in remittances leads to a large increase in both types of migration, suggesting a certain level of dependence on remittances among the households receiving them since they send other members away when this is the case (note that the ability to send new members away may be facilitated by network effects that having other members who migrated before entail).

Apart from shocks, a number of individual level characteristics affect the probability of migration. Younger individuals are more likely to migrate permanently, given that they have often not yet created a household at the place of origin, but age does not affect the probability of temporary migration in the same way. Better educated individuals appear to be more likely to migrate temporarily, but not permanently. Those who are married are more likely to migrate temporarily, but this is essentially the case for men who are heads of households, while married head are less likely to migrate permanently. As to household level characteristics, temporary migration is more frequent among members for the poorest households (bottom quintile of wealth), but the differences are less systematic for permanent migration. Whether households own more than one acre of land or not does not make much difference after controlling for other variables. Households where the head does not have work are more likely to have temporary migrants.

While the urban versus rural location of the household does not have a statistically significant impact on the probability to migrate, there are geographic effects at work after controlling for individual and household characteristics. The reference geographic location in the regression model is the prefecture of Tanger-Tétouhan, which is located in the tip of the northern part of the country towards Spain. In comparison to that region, temporary migration is lower in Oriental, Grand-Casablanca, Méknès-Tafilalet, and Fès-Boulemane, and higher in Souss-Massa-Draâ. Again in comparison to Tanger-Tétouhan, permanent migration is lower in Chaouia-Ouardigha, Marrakech-Tensift-Al Haouz, and Fès-Boulemane, and higher in Tadla-Azilal.

Table 3: Correlates of Individual Migration, Morocco 2009-10 (dF/dX)

	Temporary	Temporary migration		Permanent migration		
	Model 1	Model 2	Model 3	Model 4		
Individual characteristics						
Age 15 to 24	-0.016**	-0.011	0.039***	0.048***		
Age 25 to 34	0.007	0.011	0.041***	0.049***		
Age 35 to 44	0.006	0.009	0.014*	0.017**		
Age 45 to 54	-0.000	0.002	-0.011**	-0.008*		
Female	-0.061***	-0.063***	-0.026***	-0.034***		
Spouse	-0.022***	-0.021***	-0.016***	-0.011***		
Education (base No Education)						
Primary	0.021***	0.025***	-0.000	-0.001		
College	0.029***	0.032***	-0.006*	-0.007**		
Secondary	0.021**	0.021*	-0.000	-0.003		
Tertiary and up	0.084***	0.069***	0.014*	0.009		
Married	0.011**	0.013**				
Female*Married	0.016	0.017				
Household characteristics						
Head age		0.001		0.001**		
Head age squared		-0.000		-0.000		
Female Head		-0.005		-0.001		
Head Married		-0.010		-0.026***		
Head Education (base No Education)						
Primary		-0.006		0.001		
College		-0.008		0.011**		
Secondary		-0.002		0.003		
Tertiary and up		0.023		0.003		
Head Occupation (base No Work)						
Work for other		-0.004		-0.002		
Agricultural work		-0.011*		-0.001		
Non-agricultural work		-0.013***		-0.004		
Self-employment, producer		0.017		0.006		
Household size	-0.001	-0.001*	-0.005***	-0.004***		
Own more than 1 acre	-0.001	-0.001	0.006	0.008*		
Urban	-0.002	-0.002	-0.002	-0.002		
Adult female ratio		0.016		0.054***		

Source: Authors' calculations based on Morocco Household and Youth Survey 2010. Note: *** p<0.01, ** p<0.05, * p<0.1. Region dummies are included but not reported here.

Table 3 (continued): Correlates of Individual Migration, Morocco 2009-10 (dF/dX)

	Temporary migration		Permanent migration	
	Model 1	Model 2	Model 3	Model 4
Wealth index (base Q1)				
Q2	-0.010**	-0.010**	-0.007**	-0.004
Q3	-0.020***	-0.020***	-0.008**	-0.005
Q4	-0.027***	-0.027***	-0.002	-0.001
Q5	-0.017***	-0.018***	0.002	0.004
Regions				
Guélmim-Es Semara	-0.010	-0.011	0.024	0.015
Souss-Massa-Draâ	0.043***	0.044***	0.010	0.007
Gharb-Cherarda-Béni Hssen	0.021*	0.024*	-0.007	-0.006
Chaouia-Ouardigha	0.012	0.011	0.002	-0.001
Marrakech-Tensift-Al Haouz	0.015	0.017*	-0.007*	-0.006*
Oriental	-0.027***	-0.025***	-0.010**	-0.009**
Grand-Casablanca	-0.018***	-0.017***	-0.002	-0.004
Rabat-Salé-Zemmour-Zaér	0.002	0.000	-0.001	-0.002
Doukala-Abda	0.017	0.016	0.001	0.003
Tadla-Azilal	0.011	0.010	0.024**	0.021**
Méknès-Tafilalet	-0.013*	-0.013*	0.016*	0.008
Fès-Boulemane	-0.022***	-0.022***	-0.008*	-0.010***
Economic and climate shocks				
Weather shocks (Droughts; floods)	0.013**	0.014**	-0.004	-0.004
Unexpected increase in prices of food and others	0.006	0.007*	0.002	0.001
Job related shocks	0.006	0.007	0.000	0.004
Cut-off or decrease in remittances	0.066**	0.059**	0.041**	0.034**
Death/sick of HH member (including main earner)	0.003	0.002	0.005	0.002
Climate change and shock in agriculture				
Reduction in agricultural yield due to less water	0.003	0.004	0.019***	0.015**
Reduction in agricultural yield due to more water	-0.016***	-0.016***	-0.002	-0.001
Reduced job opportunities in the agricultural sector	0.002	0.002	-0.008**	-0.007**
Serious financial loss due to climate related factors	-0.001	-0.002	-0.005	-0.005
Change the economic activity after the shock	0.011	0.010	0.011	0.010
Number of observations	7,884	7,884	8,502	8,502

Source: Authors' calculations based on Morocco Household and Youth Survey 2010.

Note: *** p<0.01, ** p<0.05, * p<0.1. Region dummies are included but not reported here.

5. Conclusion

Do extreme weather events such as droughts or floods lead to migration away from the areas affected by these events in Morocco? The analysis presented in this chapter suggests that this is the case. While droughts and floods are not directly identified by households as major reasons for migration, the characteristics of areas affected by droughts, such as insufficient agricultural revenue and employment are mentioned as reasons for migration by households. Furthermore, in regression analysis, being subject to an adverse weather shock appears to increase the probability of temporary migration, and a reduction in agricultural yields due to less water (droughts) increases permanent migration. Other factors do have a larger effect on the probability of migration, so that climate and environment related variables may not be the main drivers of temporary and permanent migration. But they do appear to contribute to migration.

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