# Migration Discrete Time Event History Analysis Code for the ChitwanABM

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Uses discrete time event history analysis to parameterize the ChitwanABM using data from the Chitwan Valley Family Study.

Note the following regarding this source dataset, created from the migration\_1\_preprocess.R script:

- 1. The data contains only respondents from the CVSF who were present in the dataset, in a "local" neighborhood in Chitwan in the first month of 1996.
- 2. Only local to distant migrations are coded. A local to distant migration is defined as a person leaving the Chitwan Valley for a location outside the valley (regardless of whether they make a move within Nepal or internationally).
- 3. Age, household ID, gender, and respondent ID are all coded from the CVFS data.
- 4. Only 126 months of data were available. Given that one months was used to define the minimum period away from a household to be considered a migrant, there were only 125 months of data to consider (as migrations cannot be conclusively determined within the last one month of data).

#### Follows analysis of Massey, Axinn, and Ghimire (2010):

Massey, D. S., W. G. Axinn, and D. J. Ghimire. 2010. Environmental change and out-migration: evidence from Nepal. Population and Environment. (last accessed 16 September 2010).

### Load the data and setup R

### **Basic Statistics**

Total number of person-month records: 197131.

First check how many migrations and censored entries. Then check a cross tab of migrations with the categorical predictors:

```
##
## 0 1 <NA>
## 195726 1405 0
```

```
##
                  migr_long$agegrp
## migr_long$migr (55,99] (15,25] (25,35] (35,45] (45,55]
##
                 0
                     20565
                              32376
                                       24599
                                                22115
                                                         17052
                 1
                        123
                                496
                                                  106
                                                            84
##
                                         215
```

```
## migr_long$ethnic

## migr_long$migr UpHindu HillTibeto LowHindu Newar TeraiTibeto

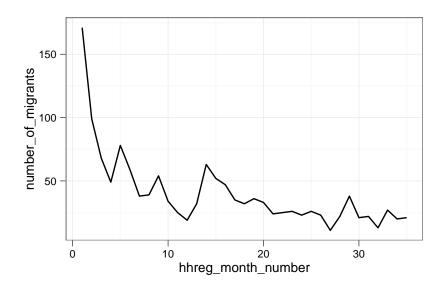
## 0 89025 29672 21378 12200 43451

## 1 718 249 135 97 206
```

```
## migr_long$gender
## migr_long$migr male female
## 0 89970 105756
## 1 736 669
```

```
##
   , , gender = male
##
##
             ethnic
              UpHindu HillTibeto LowHindu Newar TeraiTibeto
## agegrp
##
     (55,99]
                 5475
                              2153
                                         899
                                                832
                              1891
                                        1133
                                                856
                                                            2695
##
     (15, 25]
                 6594
                                                689
##
     (25, 35]
                 3796
                              1069
                                        1042
                                                            2479
                              1356
                                                588
                                                            2095
##
     (35,45]
                 3887
                                        1032
##
     (45,55]
                 3674
                             1186
                                        1037
                                                695
                                                            1450
##
##
   , , gender = female
##
##
             ethnic
              UpHindu HillTibeto LowHindu Newar TeraiTibeto
## agegrp
     (55,99]
                 4798
                              1925
                                        1011
                                                639
##
##
     (15, 25]
                 9332
                              2379
                                        1660
                                              1421
                                                            4911
##
     (25, 35]
                 7227
                              2217
                                        1806
                                                873
                                                            3616
     (35,45]
                              2134
                                                951
                                                            2305
##
                 6678
                                        1195
##
     (45,55]
                 3797
                              1642
                                        1217
                                                600
                                                            1838
##
```

And look at the number of migrations per time (censoring after 1st migration).



Migrations per month (censored)

### **Discrete-time Event History Models**

#### Fixed effect model

```
## glm(formula = migr ~ ethnic + gender + agegrp + timeyears + I(timeyears^2) +
      years_schooling + in_school_1996 + I(log(MARFT_1996 + 1)) +
      own_any_farmland, family = binomial, data = migr_long)
##
##
## Deviance Residuals:
                         3Q
## Min 1Q Median
                                   Max
## -0.368 -0.143 -0.104 -0.082
##
## Coefficients:
                      Estimate Std. Error z value Pr(>|z|)
##
## (Intercept)
                       -4.8652 0.2132 -22.82 < 2e-16 ***
## ethnicHillTibeto
                        0.2578
                                  0.1040 2.48 0.01320 *
## ethnicLowHindu
                        0.1405
                                  0.1332
                                            1.05 0.29165
## ethnicNewar
                        -0.1054
                                  0.1540 -0.68 0.49377
## ethnicTeraiTibeto
                                  0.1173 -3.84 0.00013 ***
                       -0.4501
                                  0.0811 -5.61 2.0e-08 ***
## genderfemale
                        -0.4554
## agegrp(15,25]
                        1.0220
                                  0.1865
                                            5.48 4.3e-08 ***
                        0.4081
                                  0.1853
                                            2.20 0.02767 *
## agegrp(25,35]
                                  0.1931 -0.39 0.69615
                       -0.0754
## agegrp(35,45]
                                            0.21 0.83125
                        0.0416
                                  0.1952
## agegrp(45,55]
                                   0.1665 -3.53 0.00042 ***
                       -0.5875
## timeyears
                        0.1189
## I(timeyears^2)
                                   0.0588
                                            2.02 0.04318 *
## years_schooling
                         0.0726
                                   0.0112
                                            6.49 8.3e-11 ***
                                          -2.16 0.03047 *
## in school 1996
                        -0.2230
                                   0.1031
## I(log(MARFT_1996 + 1)) 0.0225
                                  0.0313
                                            0.72 0.47190
                       -0.0672
## own_any_farmlandTRUE
                                  0.1076 -0.62 0.53208
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
     Null deviance: 8922.7 on 96341 degrees of freedom
## Residual deviance: 8487.5 on 96326 degrees of freedom
## (100789 observations deleted due to missingness)
## AIC: 8520
##
## Number of Fisher Scoring iterations: 8
```

```
coef odds_ratio se_coef
##
## (Intercept)
                                0.0077 0.2132
                        -4.8652
## ethnicHillTibeto
                       0.2578
                                   1.2940
                                          0.1040
## ethnicLowHindu
                        0.1405
                                   1.1508 0.1332
## ethnicNewar
                        -0.1054
                                  0.9000 0.1540
## ethnicTeraiTibeto
                       -0.4501
                                  0.6376 0.1173
                       -0.4554
                                   0.6342 0.0811
## genderfemale
                                   2.7786 0.1865
## agegrp(15,25]
                        1.0220
## agegrp(25,35]
                        0.4081
                                   1.5039 0.1853
                      -0.0754
## agegrp(35,45]
                                   0.9274 0.1931
## agegrp(45,55]
                        0.0416
                                   1.0425 0.1952
```

```
## timeyears
                        -0.5875
                                    0.5557 0.1665
## I(timeyears^2)
                                    1.1263 0.0588
                        0.1189
## years_schooling
                        0.0726
                                    1.0753 0.0112
## in_school_1996
                        -0.2230
                                    0.8001 0.1031
## I(log(MARFT_1996 + 1)) 0.0225
                                    1.0228 0.0313
                                    0.9350 0.1076
## own_any_farmlandTRUE -0.0672
```

## Mixed-effects model - random intercept at neighborhood level (age groups)

```
## Length Class Mode
## 1 mer S4
```

```
##
                           coef se_coef odds_ratio
                        -4.9032 0.2245
## (Intercept)
                                         0.0074
## ethnicHillTibeto
                        0.2005 0.1157
                                          1.2220
                        0.1035 0.1455
## ethnicLowHindu
                                           1.1091
                       -0.1583 0.1654
-0.4836 0.1367
## ethnicNewar
                                           0.8536
## ethnicTeraiTibeto
## genderfemale
                                           0.6166
                       -0.4722 0.0827
                                           0.6236
                       1.0286 0.1901
## agegrp(15,25]
                                           2.7970
                       0.4343 0.1887
                                          1.5440
## agegrp(25,35]
                    -0.0624 0.1966
0.0486 0.1985
## agegrp(35,45]
                                           0.9395
## agegrp(45,55]
                                           1.0498
                       -0.5658 0.1682
## timeyears
                                           0.5679
## I(timeyears^2)
                       0.1163 0.0594
                                          1.1233
1.0746
                                           0.8202
## I(log(MARFT_1996 + 1)) 0.0255 0.0392
                                           1.0258
## own_any_farmlandTRUE -0.0726 0.1150
                                           0.9299
```

## Mixed-effects model - random intercepts at individual and neighborhood level (age groups)

```
## Warning: false convergence (8)
```

```
## Length Class Mode
## 1 mer S4
```

```
coef se_coef odds_ratio
##
## (Intercept)
                        -27.0704 2.7229 0.000e+00
## ethnicHillTibeto
                         -0.2797 1.6790 7.560e-01
## ethnicLowHindu
                         -0.2321 2.1333 7.929e-01
## ethnicNewar
                         -1.0573 2.5098 3.474e-01
                      -0.8437 1.8822 4.301e-01
## ethnicTeraiTibeto
                         -0.7431
                                  1.2783 4.757e-01
## genderfemale
## agegrp(15,25]
                         -1.1417 2.1656
                                          3.193e-01
                         0.1703 2.0878
                                         1.186e+00
## agegrp(25,35]
                         -0.4356 2.0406 6.469e-01
## agegrp(35,45]
## agegrp(45,55]
                         -0.4038 1.9329 6.678e-01
```

```
## timeyears 10.4894 0.6624 3.593e+04
## I(timeyears^2) -1.5993 0.1971 2.020e-01
## years_schooling 0.1272 0.1728 1.136e+00
## in_school_1996 1.5838 1.5522 4.874e+00
## I(log(MARFT_1996 + 1)) 0.1423 0.4919 1.153e+00
## own_any_farmlandTRUE -0.5020 1.6912 6.053e-01
```