Maternal health seeking behavior data_clean

Fuyu

Maternal health seeking behavior

Pregnancy and childbirth are natural and often eventful processes many women are at risk for developing complications during pregnancy and childbirth. Complications of pregnancy and childbirth are the leading causes of disability and death among women in the reproductive age (15-49) years in developing countries. Maternal health seeking behavior normally includes three aspects according to articles: 1) antenatal care(ANC). 2) birth of place 3) post-natal care(PNC). According to literatures I have read, most researches focus on antenatal care and delivery birth place. Only one research in Eastern Ethiopia studied PNC utilization.

Besides, most researches treat these three aspects separately. I will present dependent variables they used below:

- 1) ANC: utilize ANC or not (binary varibale); Number of visits. WHO recommended woman with pregancy visits ANC at least 4 times.
- 2) Delivery place: In healthy facilities or in home; Assited by professional health care workers or traditional care workers?
- 3) PNC: utilize ANC or not (binary varibale)

Logically, these three aspects complies a complete pregnancy process, and they are not determined independently. However, if we use regress later stage on previous stage, e.g. dependent variable is delivery place, independent variables are ANC utilization and other demographic, social-economic factors. Linearity and other statistical association between demographic, social-economic factors and ANC utilization will make the variation of estimation in Delivery place model too large to accept.

Therefore, I try to do a clustering analysis on ANC, delivery place and PNC variables. I want to treat them as a whole and do a multinomial regression to explore which factors influence their choice pattern.

Read and Merge data

```
library(dplyr)

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':

##
## filter, lag

## The following objects are masked from 'package:base':

##
## intersect, setdiff, setequal, union

library(foreign)
library(data.table)
```

##

Create Personal ID

```
wm$HH<-paste(wm$HH1,wm$HH2,sep = "_")
wm$HHL<-paste(wm$HH,wm$LN,sep = "_")
sum(duplicated(wm$HHL))
## [1] 0
wm[] <- lapply(wm, unclass)
sum(duplicated(wm$HH))
## [1] 5492
wm_new<-base::merge(wm,hh,by=c("HH","HH1","HH2"),all=F)
rm(hh,wm)
sum(duplicated(wm_new$HHL))
## [1] 0</pre>
```

We choose those who gave birth in last two years before the survey year

```
wm_new$year=floor(wm_new$WDOBLC/12)+1900
wm_new<-as.data.table(wm_new)
wm_use<-wm_new[year-WM6Y>=-2]
```

WM6Y: Survey Year; year: Birth year

```
table(wm_use$WM6Y,wm_use$year)

##

## 2015 2016 2017 2018

## 2017 97 120 129 8

## 2018 0 3242 4426 1872

rm(wm_new)
table(wm_use$CM17)
```

##

```
##
      0
## 1306 8560
table(wm_use$WM6Y,wm_use$year)
##
##
          2015 2016 2017 2018
##
     2017
            97 120 129
##
     2018
             0 3242 4426 1872
wm_use<-wm_use[!(WM6Y==2017&year==2018),]
table(wm_use$WM6Y,wm_use$year)
##
##
          2015 2016 2017 2018
##
     2017
            97 120 129
     2018
             0 3242 4426 1872
##
clean data
MN2: attend ANC or not MN20: Delivery place
wm_clean<-wm_use[!is.na(MN2)&!is.na(MN20)]</pre>
wm clean<-wm use [MN2!=9&MN20!=9]
table(wm_clean$WM6Y,wm_clean$year)
##
          2016 2017 2018
##
##
     2017 119 129
     2018 2045 4404 1850
##
rm(wm_use)
ac4:ANC at least 4 times
wm_clean$MN5[wm_clean$MN2==2]=0
table(wm_clean$MN5) #you could see there are some outliers
##
##
      0
           1
                 2
                      3
                                 5
                                      6
                                            7
                                                 8
                                                      9
                                                           10
                                                                11
                                                                      12
                                                                           13
                                                                                15
                                                                                      16
         372 1035 1981 1579
                                                77
                                                           27
                                                                            2
                                                                                 3
## 1935
                               828
                                    456
                                          130
                                                     39
                                                                 1
                                                                      16
                                                                                      11
##
     18
          20
                21
                     22
                          27
                                30
                                     36
                                           46
                                                60
                                                     72
                                                           82
                                                                98
                                                                      99
##
      1
           1
                 1
                      1
                                      3
                                                                38
#drop non-response
wm_clean<-wm_clean[MN5!=98]
table(wm_clean$MN5)
##
##
      0
           1
                 2
                      3
                                 5
                                      6
                                            7
                                                 8
                                                       9
                                                           10
                                                                11
                                                                      12
                                                                           13
                                                                                 15
                                                                                      16
## 1935
         372 1035 1981 1579
                               828
                                    456
                                         130
                                                77
                                                     39
                                                           27
                                                                 1
                                                                      16
                                                                            2
                                                                                 3
                                                                                      11
                21
                                                60
                                                     72
                                                           82
                                                                99
##
     18
          20
                     22
                          27
                                30
                                     36
                                           46
##
      1
           1
                 1
                      1
                                 1
                                      3
                                            1
                                                 1
                                                      3
                                                            1
                                                                 2
                           1
# create new variable to see if the women vistis antenatal care at leats 4 times
wm_clean$ac4<-0
wm_clean$ac4[wm_clean$MN5>=4]<-1</pre>
```

```
# where give birth to
table(wm_clean$MN20)
##
##
          12
                     22
                           23
                                     31
                                                           99
     11
                21
                                26
                                           32
                                                36
                                                      96
## 2129
         429
              959 2099 1453
                                    526
                                          300
                                              442
                                                      84
                                                            5
                                83
wm_clean<-wm_clean[MN20!=99]
```

probithpl: Delivery place

```
#create where probithpl to indicate the birth place
wm_clean$probithpl<-1
wm_clean$probithpl[wm_clean$MN20<=12|wm_clean$MN20==96]<-0
wm_clean$probithpl[wm_clean$PN7]

## numeric(0)
table(wm_clean$probithpl)

##
## 0 1
## 2642 5862</pre>
```

PNC utilization

HH

##

```
#postnatal check
wm_clean<-wm_clean[PN25A!=9&PN25A!=8]
wm_clean<-wm_clean[PN25B!=9&PN25B!=8]
wm_clean<-wm_clean[PN25C!=9&PN25C!=8]
summary(wm_clean)</pre>
```

HH2

LN

```
Length:8467
                                               : 1.00
                                                                : 1.000
##
                       Min.
                               : 1.0
                                        Min.
                                                         Min.
##
    Class : character
                        1st Qu.:205.0
                                        1st Qu.: 8.00
                                                         1st Qu.: 2.000
    Mode :character
                       Median :396.0
                                        Median :15.00
                                                         Median : 2.000
##
                        Mean
                               :382.5
                                        Mean
                                               :15.16
                                                                : 2.164
                                                         Mean
                       3rd Qu.:563.0
                                        3rd Qu.:23.00
##
                                                         3rd Qu.: 2.000
##
                       Max.
                               :721.0
                                        Max.
                                               :30.00
                                                                :24.000
                                                         Max.
##
##
         CM11
                           MA1
                                           WM6Y
                                                           WB5
##
          : 1.000
                            :1.000
                                             :2017
                                                             :1.000
    Min.
                     Min.
                                      Min.
                                                      Min.
    1st Qu.: 2.000
                     1st Qu.:1.000
                                      1st Qu.:2018
                                                      1st Qu.:1.000
##
    Median : 3.000
                     Median :1.000
                                      Median:2018
                                                      Median :1.000
##
    Mean : 3.863
                     Mean :1.398
                                      Mean :2018
                                                      Mean
                                                            :1.219
    3rd Qu.: 5.000
                     3rd Qu.:2.000
                                      3rd Qu.:2018
                                                      3rd Qu.:1.000
##
##
    Max.
           :16.000
                     Max.
                             :9.000
                                      Max.
                                             :2018
                                                      Max.
                                                             :9.000
##
##
         WB6A
                         WB6B
                                        welevel
                                                        insurance
                                                                     wscoreu
##
          : 0.00
                            :1.000
                                            :0.000
   Min.
                    Min.
                                     Min.
                                                      Min.
                                                             :1
                                                                          :-1.616
                                                                  Min.
   1st Qu.:10.00
                    1st Qu.:2.000
                                     1st Qu.:1.000
                                                      1st Qu.:2
                                                                  1st Qu.:-0.865
  Median :10.00
                    Median :3.000
                                     Median :1.000
                                                      Median :2
                                                                  Median :-0.289
##
           :18.51
                            :3.276
                                                                         :-0.057
##
   Mean
                    Mean
                                     Mean
                                            :1.418
                                                      Mean
                                                             :2
                                                                  Mean
    3rd Qu.:31.00
                    3rd Qu.:5.000
                                     3rd Qu.:2.000
                                                      3rd Qu.:2
                                                                  3rd Qu.: 0.683
    Max.
           :40.00
                    Max.
                           :6.000
                                     Max.
                                            :4.000
                                                      Max.
                                                             :9
                                                                  Max.
                                                                         : 2.868
```

HH1

```
NA's
         :1849
                   NA's :1851
                                                              NA's
                                                                   :6232
##
                          WB18
                                     WM14
                                                     WM15
                                                                     WB3Y
      wscorer
                                Min. :1.000
                                                                      :1968
##
   Min.
          :-1.4233
                     Min. :1
                                                Min. :1.000
                                                               Min.
                                1st Qu.:4.000
   1st Qu.:-0.6032
                     1st Qu.:2
                                                1st Qu.:3.000
                                                               1st Qu.:1984
   Median :-0.2339
                     Median :2
                                Median :5.000
                                                Median :3.000
                                                               Median:1989
##
   Mean
         : 0.0148
                     Mean :2
                                Mean :4.848
                                                Mean :2.914
                                                               Mean :1992
   3rd Qu.: 0.3266
                     3rd Qu.:2
                                 3rd Qu.:6.000
                                                3rd Qu.:3.000
                                                                3rd Qu.:1995
          :12.9851
                                Max.
##
   Max.
                     Max. :9
                                       :9.000
                                                Max.
                                                       :3.000
                                                               Max.
                                                                      :9999
##
   NA's
          :2235
                                 NA's
                                       :1
                                                NA's
                                                      :1
##
        WB4
                       WDOBLC
                                      MN2
                                                                     MN20
                                                      MN5
   Min.
          :15.00
                   Min.
                         :1392
                                 Min.
                                        :1.000
                                                 Min. : 0.00
                                                                Min.
                                                                       :11.00
##
   1st Qu.:23.00
                   1st Qu.:1403
                                 1st Qu.:1.000
                                                 1st Qu.: 1.00
                                                                 1st Qu.:11.00
   Median :28.00
                   Median:1409
                                 Median :1.000
                                                 Median: 3.00
                                                                 Median :22.00
##
                                 Mean :1.228
                                                 Mean : 2.94
   Mean :28.51
                   Mean :1409
                                                                 Mean :21.21
##
   3rd Qu.:33.00
                   3rd Qu.:1415
                                 3rd Qu.:1.000
                                                 3rd Qu.: 4.00
                                                                 3rd Qu.:23.00
##
   Max. :49.00
                   Max.
                         :1422
                                 Max. :2.000
                                                 Max. :99.00
                                                                 Max.
                                                                       :96.00
##
##
        PN5
                       PN17
                                    MN19A
                                                       MN19C
##
   Min. :1.000
                   Min. :1.00
                                 Length:8467
                                                    Length:8467
##
   1st Qu.:1.000
                   1st Qu.:2.00
                                 Class :character
                                                    Class : character
##
   Median :1.000
                  Median :2.00
                                 Mode :character Mode :character
   Mean :1.496
                   Mean :1.93
##
   3rd Qu.:2.000
                   3rd Qu.:2.00
   Max. :9.000
                   Max. :9.00
##
##
   NA's
         :2633
                   NA's
                        :2633
##
      MN19D
                        MN19F
                                           MN19G
                                                              MN19H
##
   Length:8467
                      Length:8467
                                        Length:8467
                                                           Length:8467
   Class :character
                      Class : character
                                        Class :character
                                                           Class : character
##
   Mode :character Mode :character
                                        Mode :character
                                                           Mode :character
##
##
##
##
##
                        MN19Y
                                             PN9
                                                            PN20
      MN19X
##
   Length:8467
                      Length:8467
                                        Min. :1.000
                                                        Min. :1.000
   Class :character Class :character
                                        1st Qu.:1.000
                                                        1st Qu.:2.000
##
##
   Mode : character Mode : character
                                        Median :2.000
                                                        Median :2.000
##
                                        Mean :1.722
                                                        Mean :1.922
##
                                        3rd Qu.:2.000
                                                        3rd Qu.:2.000
##
                                        Max.
                                               :9.000
                                                               :9.000
                                                        Max.
                                        NA's
##
                                               :6708
                                                               :7593
                                                        NA's
##
       PN25A
                       PN25B
                                      PN25C
                                                       CM17
                                                                 HHL
                                        :1.000
##
   Min. :1.000
                   Min. :1.000
                                  Min.
                                                  Min.
                                                         :1
                                                              Length:8467
##
   1st Qu.:1.000
                   1st Qu.:2.000
                                  1st Qu.:2.000
                                                  1st Qu.:1
                                                              Class : character
   Median :2.000
                   Median :2.000
                                  Median :2.000
                                                  Median :1
                                                              Mode :character
   Mean :1.707
##
                   Mean :1.838
                                  Mean :1.789
                                                  Mean :1
##
   3rd Qu.:2.000
                   3rd Qu.:2.000
                                  3rd Qu.:2.000
                                                  3rd Qu.:1
##
   Max. :2.000
                   Max. :2.000
                                  Max. :2.000
                                                  Max. :1
##
                                        HC2
                                                        HH7
##
        HC1A
                         HC1B
##
  Min. : 1.000
                          :1.000
                                   Min. :1.000
                    Min.
                                                  Min. : 1.00
  1st Qu.: 1.000
                    1st Qu.:4.000
                                   1st Qu.:1.000
                                                   1st Qu.: 8.00
## Median : 2.000
                    Median :6.000
                                   Median :1.000
                                                   Median :15.00
## Mean : 9.887
                    Mean :4.925
                                   Mean :1.259
                                                   Mean :14.24
```

```
##
   3rd Qu.: 6.000
                    3rd Qu.:6.000
                                    3rd Qu.:1.000
                                                    3rd Qu.:21.00
##
   Max.
          :99.000
                           :9.000
                                           :6.000
                                                           :26.00
                    Max.
                                    Max.
                                                    Max.
##
   NA's
          :1
                    NA's
                          : 1
                                    NA's
                                           :1
##
                                                     probithpl
      helevel
                        year
                                       ac4
##
   Min.
          :0.000
                   Min.
                          :2016
                                Min.
                                         :0.0000
                                                   Min.
                                                          :0.000
                                 1st Qu.:0.0000
##
   1st Qu.:1.000
                   1st Qu.:2016
                                                   1st Qu.:0.000
  Median :2.000
                                  Median :0.0000
                                                   Median :1.000
##
                   Median:2017
## Mean
          :1.957
                   Mean
                          :2017
                                  Mean
                                         :0.3743
                                                   Mean
                                                          :0.689
##
   3rd Qu.:3.000
                   3rd Qu.:2017
                                  3rd Qu.:1.0000
                                                   3rd Qu.:1.000
## Max. :9.000
                   Max.
                          :2018
                                  Max. :1.0000
                                                   Max.
                                                          :1.000
##
# drop irrational year
```

ONE BIG PROBLEM

Only women having live births is last two years are asked about their maternal health seeking behavior. So a selection bias exists.

"

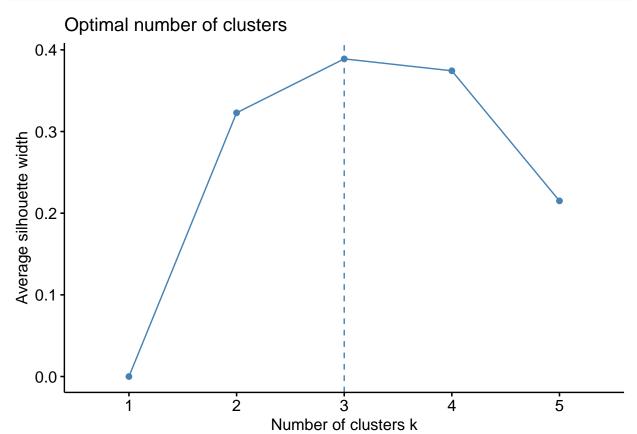
Do clustering analysis

```
library(ggplot2)
library(cluster)
library(clustMixType)
library(dplyr)
library(readr)
library(klaR)
## Loading required package: MASS
##
## Attaching package: 'MASS'
## The following object is masked from 'package:dplyr':
##
##
       select
library(factoextra)
## Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa
wm_clean<-read.csv("D:\\tang_data\\cleandata0503.csv")</pre>
hsb<-dplyr::select(wm_clean,MN2,ac4,probithpl,PN25A,
                PN25B, PN25C)
```

Silhouette Index help to determine the optimal cluster numbers

we use five variables to typologzie women's maternal health seeking behavior: 1)ANC attendence 2)At least 4 times ANC 3)delivery place 4)PNC: examine the cord 5)PNC: take temperature 6)PNC: consel on breastfeeding

```
s<-fviz_nbclust(x=hsb,FUNcluster = kmodes, method = "silhouette",k.max = 5)
s</pre>
```



```
hsb[] <- lapply(hsb, unclass)
```

Therefore we choose 3 clusters

```
set.seed(2)
r<-kmodes(hsb,modes=3)
results<-r$modes
results$MN2[results$MN2==2]<-0
results$PN25A[results$PN25A==2]<-0
results$PN25B[results$PN25B==2]<-0
results$PN25C[results$PN25C==2]<-0
results</pre>
```

MN2: ANC attendence 0: Never Visited 1: Have visited AC4: At least 4 times ANC visits: 0: below 4 times(including never); 1: 4 times and above

probithpl: Delivery place 0: Not in a health professional places 1: Health professional places

PN25A: Examine the cord during the first two days after birth 0:No 1: Yes

PN25B: Examine the temperature during the first two days after birth 0:No 1: Yes

PN25C: Counsel you on breastfeeding during the first two days after birth 0:No 1: Yes

clustering results

Cluster 1: They have fully utilize the maternal health services

Cluster 2: They don't utilize any maternal health services

Cluster 3: They have utilize most of the maternal health services but below the recommended standard

Then I try to use multinomial logit regression to explore demographic, socio-economic status factors influencing their maternal health seeking behavior