Basic risk assessment

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```
1
First read in the data.
library(dataPakistan)
library(ggplot2)
## Warning: package 'ggplot2' was built under R version 3.5.3
library(dplyr)
## Warning: package 'dplyr' was built under R version 3.5.3
## 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
file_location <- system.file("extdata", package = "dataPakistan")</pre>
Admin <- readxl::read_excel(path = paste0(file_location, "/Admin-datasheet-year2018.xlsx"))
AFP <- readxl::read_excel(path = paste0(file_location, "/List of AFP Cases 2015-2019.xlsx"), sheet = "D
pop <- readxl::read_excel(path = paste0(file_location, "/Population under 15-estimates 2018-19 as 19051</pre>
dat_AFP <- AFP[, c("YRONSET", "MTHONSET", "DISTRICT")]</pre>
AFP_agg <-
  dat_AFP %>%
  group_by(YRONSET, MTHONSET, DISTRICT) %>%
  summarise(cases = n())
library(lubridate)
## Warning: package 'lubridate' was built under R version 3.5.3
##
## Attaching package: 'lubridate'
## The following object is masked from 'package:base':
##
##
       date
Admin$year <- year(Admin$Year)</pre>
Admin$month <- month(Admin$Year)
dat_Admin <- Admin[ ,c("year",</pre>
                        "District", "Total children vaccinated (Household Vaccination + Other Vaccination
```

```
Admin_agg <-
  dat_Admin %>%
  group_by(year, month, District) %>%
  summarise(vaccinated = sum(`Total children vaccinated (Household Vaccination + Other Vaccination) n`)
alldat <- merge(Admin_agg, AFP_agg,
                by.x = c("year", "month", "District"),
                by.y = c("YRONSET", "MTHONSET", "DISTRICT"))
alldat <- merge(alldat, pop,
                by.x = "District",
                by.y = "DISTRICT")
alldat$yearmonth <- paste(alldat$year, alldat$month, sep = "_")
alldat$notcase <- round(alldat$`POPL15 (2018)` - alldat$cases,0)
glm(formula = cbind(alldat$cases, alldat$notcase) ~ yearmonth + District + vaccinated,
    family = binomial(link="logit"), data = alldat)
##
##
   Call: glm(formula = cbind(alldat$cases, alldat$notcase) ~ yearmonth +
       District + vaccinated, family = binomial(link = "logit"),
##
       data = alldat)
##
   Coefficients:
##
             (Intercept)
                                yearmonth2018_11
                                                        yearmonth2018_12
                                                               1.342e-01
##
              -1.150e+01
                                       1.410e-01
##
         yearmonth2018_2
                                 yearmonth2018_3
                                                         yearmonth2018_4
##
              -1.271e-01
                                      -2.113e-02
                                                              -1.435e-02
                                                         yearmonth2018_8
##
         yearmonth2018_5
                                 yearmonth2018_7
##
              -1.693e-02
                                      -1.400e-01
                                                              -1.929e-03
##
          DistrictASTORE
                                  DistrictATTOCK
                                                          DistrictAWARAN
##
               1.099e+00
                                      -3.968e-01
                                                               6.462e-01
##
           DistrictBADIN
                                    DistrictBAGH
                                                      DistrictBAHAWALPUR
##
              -3.089e-01
                                       8.792e-01
                                                              -3.668e-01
##
      DistrictBAHWLNAGAR
                                  DistrictBAJOUR
                                                           DistrictBANNU
##
              -4.343e-01
                                       8.601e-01
                                                               3.134e-01
##
                                DistrictBATAGRAM
         DistrictBARKHAN
                                                         DistrictBHAKKAR
##
               7.951e-01
                                       6.635e-01
                                                              -4.107e-01
##
         DistrictBHIMBER
                                   DistrictBOLAN
                                                           DistrictBUNER
##
               1.627e-01
                                       2.862e-01
                                                               2.660e-02
                                 DistrictCHAGHAI
                                                         DistrictCHAKWAL
##
             DistrictCDA
##
               8.775e-02
                                       2.613e-01
                                                               2.714e-01
##
        DistrictCHARSADA
                                 DistrictCHINIOT
                                                         DistrictCHITRAL
##
               6.482e-01
                                       1.127e-01
                                                               4.728e-01
##
            DistrictDADU
                                  DistrictDBUGTI
                                                          DistrictDGKHAN
##
              -1.816e-01
                                       2.328e-01
                                                               5.167e-01
##
          DistrictDIAMER
                                  DistrictDIKHAN
                                                        DistrictDIRLOWER
##
               1.004e+00
                                      -6.052e-02
                                                               4.457e-01
##
        DistrictDIRUPPER
                                   DistrictDUKKI
                                                      DistrictFAISALABAD
                                       7.868e-01
##
               1.869e-01
                                                              -6.073e-01
##
        DistrictFR BANNU
                               DistrictFR DIKHAN
                                                        DistrictFR KOHAT
##
               3.023e+00
                                       1.399e+00
                                                               1.329e+00
##
        DistrictFR LAKKI
                             DistrictFR PESHAWAR
                                                         DistrictFR TANK
```

##	2.317e+00	1.734e+00	2.306e+00
##	DistrictGHANCHE	DistrictGHIZER	DistrictGHOTKI
##	5.226e-01	9.449e-01	-9.266e-02
##	DistrictGILGIT	DistrictGUJRANWALA	DistrictGUJRAT
##	-1.299e-01	-1.444e-01	-7.249e-02
##	-1.299e-01 DistrictGWADUR	DistrictHAFIZABAD	DistrictHANGU
##	4.173e-01	1.492e-01	4.949e-01
	4.173e-01 DistrictHARIPUR		4.949e-01 DistrictHAVELI
##	-7.301e-02	DistrictHARNAI 1.309e+00	3.445e-01
##	-7.301e-02 DistrictHUNZA	DistrictHYDERABAD	J.445e-01 DistrictICT
	1.504e+00	-2.357e-01	3.035e-01
##			
##	DistrictJACOBABAD	DistrictJAFARABAD	DistrictJAMSHORO
##	3.728e-01	1.155e-01	2.998e-01
##	DistrictJHALMAGSI	DistrictJHANG	DistrictJHELUM
##	8.903e-01	-3.961e-01	-6.543e-02
##	DistrictKABDULAH	DistrictKALAT	DistrictKAMBAR
##	-5.347e-03	1.854e-01	4.648e-01
##	DistrictKARAK	DistrictKASHMORE	DistrictKASUR
##	6.442e-01	-1.175e-01	-7.152e-01
##	DistrictKECH	DistrictKHAIRPUR	DistrictKHANEWAL
##	-1.549e+00	-5.227e-02	-2.969e-01
##	$ ext{DistrictKHARAN}$	DistrictKHARMANG	DistrictKHIBALDIA
##	3.568e-01	1.299e+00	-3.029e-01
##	DistrictKHIBINQASIM	$ ext{DistrictKHIGADAP}$	$ exttt{DistrictKHIGIQBAL}$
##	-5.488e-01	-5.740e-01	-6.690e-01
##	DistrictKHIGULBERG	DistrictKHIJAMSHEED	DistrictKHIKAMARI
##	-7.305e-02	-2.852e-01	-2.890e-01
##	DistrictKHIKORANGI	$ ext{DistrictKHILANDHI}$	DistrictKHILAYARI
##	-6.261e-01	2.794e-01	-6.375e-01
##	$ exttt{DistrictKHILIAQAT}$	$ ext{DistrictKHIMALIR}$	DistrictKHINNAZIM
##	-2.672e-01	1.986e-02	-1.422e-01
##	DistrictKHINORTH	DistrictKHIORANGI	DistrictKHISADDAR
##	-6.228e-01	-1.836e-01	-4.620e-01
##	DistrictKHISHAHFAISAL	DistrictKHISITE	DistrictKHUSHAB
##	1.185e-01	-1.055e-01	8.611e-02
##	$ exttt{DistrictKHUZDAR}$	DistrictKHYBER	DistrictKOHAT
##	-4.106e-01	9.787e-01	3.157e-01
##	$ ext{DistrictKOHISTAN}$	$ exttt{DistrictKOHLU}$	DistrictKOTLI
##	-1.404e-01	-1.924e-02	8.135e-02
##	$ ext{DistrictKSAIFULAH}$	$ exttt{DistrictKURRAM}$	$ ext{DistrictLAHORE}$
##	3.323e-01	4.112e-01	-7.797e-01
##	DistrictLAKKIMRWT	DistrictLARKANA	$ exttt{DistrictLASBELA}$
##	1.124e+00	1.972e-01	-4.915e-01
##	DistrictLAYYAH	DistrictLODHRAN	${ t DistrictLORALAI}$
##	3.219e-03	-5.305e-02	2.191e-01
##	${ t DistrictMALAKAND}$	DistrictMANSEHRA	${ t DistrictMARDAN}$
##	4.867e-01	-4.330e-01	5.263e-01
##	DistrictMASTUNG	$ exttt{DistrictMATIARI}$	DistrictMBDIN
##	8.830e-02	2.352e-01	2.713e-01
##	DistrictMIANWALI	DistrictMIRPUR	DistrictMIRPURKHAS
##	1.291e-01	-2.037e-01	-2.959e-01
##	DistrictMOHMAND	DistrictMULTAN	DistrictMUSAKHEL
##	8.639e-01	-5.987e-01	9.175e-01
##	DistrictMUZAFFARABAD	DistrictMUZFARGARH	${ t DistrictNAGAR}$

```
-7.249e-01
                                       -2.387e-02
                                                                1.143e+00
##
                                 DistrictNAROWAL
                                                          DistrictNEELUM
    DistrictNANKANASAHIB
               1.290e-01
                                       -5.662e-02
                                                                4.534e-01
##
##
          DistrictNFEROZ
                                  DistrictNOSHKI
                                                        DistrictNOWSHERA
##
              -5.273e-01
                                        5.397e-01
                                                                5.054e-01
##
        DistrictNSIRABAD
                                   DistrictOKARA
                                                         DistrictORAKZAI
##
               4.330e-01
                                       -4.129e-01
                                                                7.096e-01
                                                        DistrictPESHAWAR
##
       DistrictPAKPATTEN
                                DistrictPANJGOUR
##
              -1.259e-01
                                        7.225e-01
                                                                1.794e-01
                                                          DistrictQUETTA
##
          DistrictPISHIN
                                  DistrictPOONCH
##
               1.951e-01
                                        8.049e-01
                                                               -6.601e-01
##
        DistrictRAJANPUR
                              DistrictRAWALPINDI
                                                          DistrictRYKHAN
##
               2.859e-01
                                       -1.623e-01
                                                               -1.188e-01
##
         DistrictSAHIWAL
                                 DistrictSANGHAR
                                                        DistrictSARGODHA
##
              -6.765e-02
                                       -4.611e-01
                                                               -4.450e-01
##
    DistrictSBENAZIRABAD
                                 DistrictSHANGLA
                                                         DistrictSHARANI
##
              -4.499e-01
                                        4.863e-01
                                                                3.279e-01
                                                       DistrictSHIKARPUR
##
     DistrictSHEIKHUPURA
                                  DistrictSHIGAR
##
              -4.351e-01
                                        1.821e+00
                                                                2.398e-01
##
         DistrictSIALKOT
                                                          DistrictSKARDU
                                    DistrictSIBI
##
              -2.871e-01
                                        1.162e-01
                                                                4.362e-01
##
       DistrictSOHBATPUR
                          DistrictSSIKANDARABAD
                                                         DistrictSUDNUTI
##
               4.700e-01
                                        7.616e-01
                                                                1.338e+00
##
         DistrictSUJAWAL
                                  DistrictSUKKUR
                                                           DistrictSWABI
##
                                        5.032e-02
               1.134e+00
                                                                6.567e-01
##
            DistrictSWAT
                              DistrictT.ALLAHYAR
                                                             DistrictTANK
##
               1.597e-01
                                       -1.396e-01
                                                                7.950e-01
##
      DistrictTHARPARKAR
                                  DistrictTHATTA
                                                           DistrictTMKHAN
##
              -2.342e-01
                                       -9.380e-02
                                                               -1.106e-01
##
         DistrictTORGHAR
                                 DistrictTTSINGH
                                                         DistrictUMERKOT
##
               7.458e-01
                                        3.098e-03
                                                                9.029e-02
##
          DistrictVEHARI
                                  DistrictWASHUK
                                                         DistrictWAZIR-N
##
              -4.866e-01
                                        8.844e-01
                                                                8.636e-01
##
         DistrictWAZIR-S
                                    DistrictZHOB
                                                          DistrictZIARAT
##
               3.750e-01
                                        3.676e-01
                                                                2.509e-01
##
              vaccinated
##
               2.027e-07
##
  Degrees of Freedom: 1021 Total (i.e. Null); 844 Residual
```

Null Deviance: 2422

Residual Deviance: 888.5 AIC: 4749