Stat 536 HW3

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Question A

##

```
rm(list = ls())
data <- read.table("policestops.txt",header = TRUE)</pre>
attach(data)
model1A <- glm(mystops ~ 1,family=poisson(link = "log"))</pre>
summary(model1A)
##
## Call:
## glm(formula = mystops ~ 1, family = poisson(link = "log"))
## Deviance Residuals:
##
       Min
                 1Q
                     Median
                                   3Q
                                           Max
## -33.049 -22.552 -8.788
                                9.343
                                        65.227
##
## Coefficients:
##
               Estimate Std. Error z value Pr(>|z|)
## (Intercept) 6.370053
                          0.002758
                                      2309
                                             <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
##
       Null deviance: 123333 on 224 degrees of freedom
## Residual deviance: 123333 on 224 degrees of freedom
## AIC: 125041
## Number of Fisher Scoring iterations: 5
model2A <- glm(mystops ~ factor(myeth),family=poisson(link = "log"))</pre>
summary(model2A)
##
## Call:
## glm(formula = mystops ~ factor(myeth), family = poisson(link = "log"))
##
## Deviance Residuals:
##
       Min
                 1Q
                     Median
                                   3Q
                                           Max
## -42.184 -16.723
                     -6.891
                              8.867
                                        57.213
```

```
## Coefficients:
##
                   Estimate Std. Error z value Pr(>|z|)
                   6.836231
## (Intercept)
                              0.003784 1806.41
## factor(myeth)2 -0.447714
                              0.006061 -73.87
                                                 <2e-16 ***
## factor(myeth)3 -1.414281
                              0.008558 -165.26
                                                 <2e-16 ***
##
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
##
   (Dispersion parameter for poisson family taken to be 1)
##
##
       Null deviance: 123333 on 224
                                      degrees of freedom
## Residual deviance: 88771 on 222 degrees of freedom
  AIC: 90484
##
## Number of Fisher Scoring iterations: 5
model3A <- glm(mystops ~ factor(myprecinct), family=poisson(link = "log"))</pre>
summary(model3A)
##
## Call:
## glm(formula = mystops ~ factor(myprecinct), family = poisson(link = "log"))
##
## Deviance Residuals:
##
                                   30
                                           Max
       Min
                 10
                      Median
##
  -46.573 -17.709
                      -2.450
                                9.459
                                        45.206
##
## Coefficients:
##
                        Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                         4.85463
                                    0.05096
                                            95.255 < 2e-16 ***
## factor(myprecinct)2 -0.10392
                                    0.07402
                                             -1.404 0.160352
## factor(myprecinct)3
                        1.42639
                                    0.05676
                                             25.132
                                                     < 2e-16 ***
## factor(myprecinct)4
                         1.29881
                                    0.05750
                                             22.588 < 2e-16 ***
                                             25.094
## factor(myprecinct)5
                        1.42452
                                    0.05677
                                                     < 2e-16 ***
## factor(myprecinct)6
                        1.21457
                                    0.05804
                                             20.927
                                                     < 2e-16 ***
## factor(myprecinct)7
                         0.52219
                                    0.06433
                                              8.117 4.76e-16 ***
## factor(myprecinct)8
                                             24.741
                                                     < 2e-16 ***
                         1.40686
                                    0.05686
## factor(myprecinct)9
                        -0.30075
                                    0.07814
                                             -3.849 0.000119 ***
## factor(myprecinct)10
                        1.09948
                                    0.05884
                                             18.685
                                                    < 2e-16 ***
## factor(myprecinct)11
                         0.77777
                                    0.06157
                                             12.633 < 2e-16 ***
## factor(myprecinct)12
                         0.83121
                                    0.06106
                                             13.613 < 2e-16 ***
## factor(myprecinct)13
                         1.74976
                                    0.05522
                                             31.689
                                                     < 2e-16 ***
## factor(myprecinct)14
                         1.10723
                                    0.05879
                                             18.835 < 2e-16 ***
## factor(myprecinct)15
                         1.81867
                                    0.05494
                                             33.101 < 2e-16 ***
## factor(myprecinct)16
                         0.91888
                                    0.06028
                                             15.244
                                                     < 2e-16 ***
## factor(myprecinct)17
                         0.89900
                                    0.06045
                                             14.871 < 2e-16 ***
## factor(myprecinct)18
                                    0.05497
                                             32.979
                                                     < 2e-16 ***
                         1.81275
                                             21.138 < 2e-16 ***
## factor(myprecinct)19
                         1.22530
                                    0.05797
## factor(myprecinct)20
                         1.40304
                                    0.05689
                                             24.664
                                                     < 2e-16 ***
## factor(myprecinct)21
                                    0.05672
                                             25.257
                         1.43261
                                                     < 2e-16 ***
## factor(myprecinct)22
                                    0.05334
                                             44.022 < 2e-16 ***
                         2.34828
                                                     < 2e-16 ***
                                             32.761
## factor(myprecinct)23
                         1.80210
                                    0.05501
## factor(myprecinct)24
                         1.91845
                                    0.05458
                                             35.150
                                                     < 2e-16 ***
## factor(myprecinct)25
                         2.25878
                                    0.05356
                                             42.172 < 2e-16 ***
## factor(myprecinct)26 1.38694
                                    0.05698
                                             24.342 < 2e-16 ***
```

```
## factor(myprecinct)27
                          1.65016
                                     0.05564
                                               29.656
                                                       < 2e-16 ***
## factor(myprecinct)28
                          0.85137
                                     0.06088
                                               13.985
                                                       < 2e-16 ***
                                               37.140
## factor(myprecinct)29
                          2.01508
                                     0.05426
                                                       < 2e-16 ***
                          1.72323
                                     0.05533
                                               31.147
                                                       < 2e-16 ***
## factor(myprecinct)30
## factor(myprecinct)31
                          1.54507
                                     0.05614
                                               27.523
                                                       < 2e-16 ***
## factor(myprecinct)32
                          0.99469
                                     0.05965
                                               16.676
                                                       < 2e-16 ***
## factor(myprecinct)33
                          2.04173
                                     0.05417
                                               37.690
                                                       < 2e-16 ***
                                                       < 2e-16 ***
## factor(myprecinct)34
                          1.98770
                                     0.05434
                                               36.576
## factor(myprecinct)35
                          0.63155
                                     0.06308
                                               10.012
                                                       < 2e-16 ***
## factor(myprecinct)36
                          1.12762
                                     0.05864
                                               19.230
                                                       < 2e-16 ***
## factor(myprecinct)37
                          0.95151
                                     0.06000
                                               15.858
                                                       < 2e-16 ***
                                               27.557
## factor(myprecinct)38
                          1.54673
                                     0.05613
                                                       < 2e-16 ***
                          1.85630
## factor(myprecinct)39
                                     0.05480
                                               33.873
                                                       < 2e-16 ***
## factor(myprecinct)40
                          0.80253
                                     0.06133
                                               13.085
                                                       < 2e-16 ***
                                     0.05570
                                               29.390
                                                       < 2e-16 ***
## factor(myprecinct)41
                          1.63710
## factor(myprecinct)42
                          1.93996
                                     0.05450
                                               35.593
                                                       < 2e-16 ***
## factor(myprecinct)43
                          1.45225
                                     0.05662
                                               25.651
                                                       < 2e-16 ***
## factor(myprecinct)44
                          1.46674
                                     0.05654
                                               25.942
                                                       < 2e-16 ***
## factor(myprecinct)45
                          2.03733
                                     0.05419
                                               37.599
                                                       < 2e-16 ***
## factor(myprecinct)46
                          2.19086
                                     0.05374
                                               40.769
                                                       < 2e-16 ***
## factor(myprecinct)47
                          0.95551
                                     0.05997
                                               15.933
                                                       < 2e-16 ***
## factor(myprecinct)48
                          1.40813
                                     0.05686
                                               24.766
                                                       < 2e-16 ***
                                                       < 2e-16 ***
## factor(myprecinct)49
                          0.99469
                                     0.05965
                                               16.676
## factor(myprecinct)50
                          2.07096
                                     0.05408
                                               38.293
                                                       < 2e-16 ***
## factor(myprecinct)51
                          1.14348
                                     0.05853
                                               19.538
                                                       < 2e-16 ***
## factor(myprecinct)52
                          1.70404
                                     0.05541
                                               30.755
                                                       < 2e-16 ***
                                               19.667
## factor(myprecinct)53
                          1.15008
                                     0.05848
                                                       < 2e-16 ***
## factor(myprecinct)54
                          0.94950
                                     0.06002
                                               15.820
                                                       < 2e-16 ***
## factor(myprecinct)55
                          1.08554
                                     0.05895
                                               18.416
                                                       < 2e-16 ***
## factor(myprecinct)56
                          0.39590
                                     0.06592
                                                6.006 1.91e-09 ***
## factor(myprecinct)57
                          0.79903
                                     0.06136
                                               13.021
                                                       < 2e-16 ***
## factor(myprecinct)58
                          1.93696
                                     0.05451
                                               35.531
                                                       < 2e-16 ***
## factor(myprecinct)59
                          1.09166
                                     0.05890
                                               18.534
                                                       < 2e-16 ***
## factor(myprecinct)60
                          2.03326
                                     0.05420
                                               37.515
                                                       < 2e-16 ***
## factor(myprecinct)61
                          1.44002
                                     0.05668
                                               25.405
                                                       < 2e-16 ***
                                               25.529
## factor(myprecinct)62
                          1.44615
                                     0.05665
                                                       < 2e-16 ***
## factor(myprecinct)63
                          1.17605
                                     0.05830
                                               20.173
                                                       < 2e-16 ***
                                               21.730
                                                       < 2e-16 ***
## factor(myprecinct)64
                          1.25536
                                     0.05777
                          1.78306
                                     0.05508
                                               32.371
                                                       < 2e-16 ***
## factor(myprecinct)65
## factor(myprecinct)66
                          2.03326
                                     0.05420
                                               37.515
                                                       < 2e-16 ***
## factor(myprecinct)67
                          1.84240
                                     0.05485
                                               33.588
                                                       < 2e-16 ***
## factor(myprecinct)68
                          1.05797
                                     0.05915
                                               17.885
                                                       < 2e-16 ***
## factor(myprecinct)69
                          1.19116
                                     0.05820
                                               20.468
                                                       < 2e-16 ***
## factor(myprecinct)70
                                     0.05478
                                               33.973
                                                       < 2e-16 ***
                         1.86116
## factor(myprecinct)71
                          2.02678
                                     0.05422
                                               37.382
                                                       < 2e-16 ***
## factor(myprecinct)72
                          2.22427
                                               41.459
                                                       < 2e-16 ***
                                     0.05365
## factor(myprecinct)73
                          2.24924
                                     0.05359
                                               41.975
                                                       < 2e-16 ***
## factor(myprecinct)74
                         1.23743
                                     0.05789
                                               21.376
                                                      < 2e-16 ***
  factor(myprecinct)75 -0.17869
                                     0.07552
                                               -2.366 0.017971 *
##
  Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##
## (Dispersion parameter for poisson family taken to be 1)
##
```

```
Null deviance: 123333 on 224 degrees of freedom
## Residual deviance: 89048
                               on 150
                                       degrees of freedom
## AIC: 90905
##
## Number of Fisher Scoring iterations: 6
model4A <- glm(mystops ~ factor(myeth)+factor(myprecinct),</pre>
               family=poisson(link = "log"))
summary(model4A)
##
## Call:
  glm(formula = mystops ~ factor(myeth) + factor(myprecinct), family = poisson(link = "log"))
##
## Deviance Residuals:
##
       Min
                 10
                      Median
                                    3Q
                                            Max
   -36.603
           -12.500
                       -2.412
                                 8.935
                                          38.919
##
##
   Coefficients:
##
                          Estimate Std. Error
                                                z value Pr(>|z|)
## (Intercept)
                          5.320809
                                     0.051031
                                                104.267 < 2e-16 ***
## factor(myeth)2
                         -0.447714
                                     0.006061
                                                -73.872
                                                         < 2e-16 ***
## factor(myeth)3
                         -1.414281
                                     0.008558 - 165.263
                                                        < 2e-16 ***
## factor(myprecinct)2
                         -0.103919
                                     0.074022
                                                 -1.404 0.160352
                          1.426389
                                                 25.132
                                                        < 2e-16 ***
## factor(myprecinct)3
                                     0.056756
## factor(myprecinct)4
                          1.298811
                                     0.057499
                                                 22.588
                                                         < 2e-16 ***
                                                 25.094
                                                        < 2e-16 ***
## factor(myprecinct)5
                         1.424516
                                     0.056766
## factor(myprecinct)6
                          1.214566
                                     0.058038
                                                 20.927
                                                         < 2e-16 ***
## factor(myprecinct)7
                          0.522189
                                     0.064329
                                                 8.117 4.76e-16 ***
## factor(myprecinct)8
                          1.406861
                                     0.056864
                                                 24.741
                                                        < 2e-16 ***
## factor(myprecinct)9
                                                 -3.849 0.000119 ***
                         -0.300754
                                     0.078142
## factor(myprecinct)10
                          1.099478
                                                 18.685
                                                         < 2e-16 ***
                                     0.058843
## factor(myprecinct)11
                          0.777775
                                     0.061569
                                                 12.633
                                                         < 2e-16 ***
## factor(myprecinct)12
                          0.831214
                                     0.061062
                                                 13.613
                                                         < 2e-16 ***
## factor(myprecinct)13
                          1.749764
                                     0.055217
                                                 31.689
                                                         < 2e-16 ***
## factor(myprecinct)14
                          1.107233
                                     0.058786
                                                 18.835
                                                         < 2e-16 ***
                                                 33.101
                                                         < 2e-16 ***
## factor(myprecinct)15
                          1.818667
                                     0.054944
## factor(myprecinct)16
                          0.918885
                                     0.060280
                                                 15.244
                                                         < 2e-16 ***
## factor(myprecinct)17
                          0.898999
                                     0.060452
                                                 14.871
                                                         < 2e-16 ***
## factor(myprecinct)18
                          1.812750
                                     0.054966
                                                 32.979
                                                         < 2e-16 ***
## factor(myprecinct)19
                          1.225302
                                     0.057967
                                                 21.138
                                                        < 2e-16 ***
## factor(myprecinct)20
                          1.403037
                                     0.056886
                                                 24.664
                                                         < 2e-16 ***
## factor(myprecinct)21
                          1.432608
                                     0.056722
                                                 25.257
                                                         < 2e-16 ***
                                                         < 2e-16 ***
## factor(myprecinct)22
                          2.348278
                                     0.053344
                                                 44.022
## factor(myprecinct)23
                          1.802095
                                     0.055008
                                                 32.761
                                                         < 2e-16 ***
## factor(myprecinct)24
                          1.918449
                                     0.054578
                                                 35.150
                                                         < 2e-16 ***
## factor(myprecinct)25
                          2.258782
                                     0.053561
                                                 42.172
                                                         < 2e-16 ***
## factor(myprecinct)26
                          1.386944
                                     0.056977
                                                 24.342
                                                         < 2e-16 ***
## factor(myprecinct)27
                          1.650156
                                     0.055643
                                                 29.656
                                                         < 2e-16 ***
## factor(myprecinct)28
                                                 13.985
                          0.851371
                                     0.060877
                                                         < 2e-16 ***
## factor(myprecinct)29
                          2.015076
                                     0.054256
                                                 37.140
                                                         < 2e-16 ***
                                                         < 2e-16 ***
## factor(myprecinct)30
                          1.723230
                                     0.055326
                                                 31.147
## factor(myprecinct)31
                          1.545073
                                     0.056138
                                                 27.523
                                                         < 2e-16 ***
## factor(myprecinct)32
                         0.994694
                                     0.059649
                                                 16.676
                                                         < 2e-16 ***
## factor(myprecinct)33
                         2.041726
                                     0.054172
                                                 37.690
                                                        < 2e-16 ***
```

```
## factor(myprecinct)34
                         1.987696
                                     0.054344
                                                 36.576
                                                        < 2e-16 ***
## factor(myprecinct)35
                          0.631548
                                     0.063076
                                                 10.012
                                                        < 2e-16 ***
                                                 19.230
## factor(myprecinct)36
                          1.127625
                                     0.058638
                                                         < 2e-16 ***
## factor(myprecinct)37
                                                 15.858
                          0.951507
                                     0.060003
                                                         < 2e-16 ***
## factor(myprecinct)38
                          1.546733
                                     0.056129
                                                 27.557
                                                         < 2e-16 ***
## factor(myprecinct)39
                          1.856298
                                     0.054802
                                                 33.873
                                                         < 2e-16 ***
## factor(myprecinct)40
                          0.802526
                                     0.061331
                                                 13.085
                                                         < 2e-16 ***
## factor(myprecinct)41
                          1.637104
                                     0.055702
                                                 29.390
                                                         < 2e-16 ***
## factor(myprecinct)42
                          1.939956
                                     0.054504
                                                 35.593
                                                         < 2e-16 ***
## factor(myprecinct)43
                          1.452252
                                     0.056615
                                                 25.651
                                                         < 2e-16 ***
## factor(myprecinct)44
                          1.466737
                                     0.056538
                                                 25.942
                                                         < 2e-16 ***
## factor(myprecinct)45
                          2.037334
                                     0.054185
                                                 37.599
                                                         < 2e-16 ***
## factor(myprecinct)46
                          2.190855
                                     0.053739
                                                 40.769
                                                         < 2e-16 ***
## factor(myprecinct)47
                          0.955511
                                     0.059970
                                                 15.933
                                                         < 2e-16 ***
## factor(myprecinct)48
                                                         < 2e-16 ***
                          1.408132
                                     0.056857
                                                 24.766
## factor(myprecinct)49
                          0.994694
                                     0.059649
                                                 16.676
                                                         < 2e-16 ***
## factor(myprecinct)50
                          2.070964
                                     0.054082
                                                 38.293
                                                         < 2e-16 ***
## factor(myprecinct)51
                          1.143478
                                     0.058525
                                                 19.538
                                                         < 2e-16 ***
## factor(myprecinct)52
                          1.704039
                                     0.055408
                                                 30.755
                                                         < 2e-16 ***
## factor(myprecinct)53
                          1.150079
                                     0.058479
                                                 19.667
                                                         < 2e-16 ***
## factor(myprecinct)54
                          0.949499
                                     0.060020
                                                 15.820
                                                         < 2e-16 ***
## factor(myprecinct)55
                          1.085540
                                     0.058946
                                                 18.416
                                                         < 2e-16 ***
## factor(myprecinct)56
                          0.395896
                                     0.065922
                                                  6.006 1.91e-09 ***
## factor(myprecinct)57
                          0.799027
                                     0.061365
                                                 13.021
                                                         < 2e-16 ***
## factor(myprecinct)58
                         1.936965
                                     0.054514
                                                 35.531
                                                         < 2e-16 ***
## factor(myprecinct)59
                          1.091662
                                     0.058900
                                                 18.534
                                                         < 2e-16 ***
## factor(myprecinct)60
                                                 37.515
                                                         < 2e-16 ***
                          2.033262
                                     0.054198
## factor(myprecinct)61
                          1.440020
                                     0.056681
                                                 25.405
                                                         < 2e-16 ***
                                                 25.529
## factor(myprecinct)62
                          1.446155
                                     0.056648
                                                         < 2e-16 ***
## factor(myprecinct)63
                         1.176054
                                     0.058298
                                                 20.173
                                                         < 2e-16 ***
## factor(myprecinct)64
                          1.255357
                                     0.057772
                                                 21.730
                                                         < 2e-16 ***
## factor(myprecinct)65
                         1.783064
                                     0.055083
                                                 32.371
                                                         < 2e-16 ***
## factor(myprecinct)66
                          2.033262
                                     0.054198
                                                 37.515
                                                         < 2e-16 ***
## factor(myprecinct)67
                          1.842403
                                     0.054854
                                                 33.588
                                                         < 2e-16 ***
## factor(myprecinct)68
                         1.057971
                                     0.059153
                                                 17.885
                                                         < 2e-16 ***
## factor(myprecinct)69
                         1.191164
                                     0.058195
                                                 20.468
                                                         < 2e-16 ***
## factor(myprecinct)70
                         1.861156
                                     0.054784
                                                 33.973
                                                         < 2e-16 ***
## factor(myprecinct)71
                         2.026780
                                                 37.382
                                                         < 2e-16 ***
                                     0.054218
## factor(myprecinct)72
                                                 41.459
                                                         < 2e-16 ***
                         2.224272
                                     0.053650
## factor(myprecinct)73
                         2.249239
                                     0.053585
                                                 41.975
                                                         < 2e-16 ***
## factor(myprecinct)74 1.237433
                                     0.057888
                                                 21.376
                                                         < 2e-16 ***
## factor(myprecinct)75 -0.178692
                                                 -2.366 0.017969 *
                                     0.075517
##
  Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
##
   (Dispersion parameter for poisson family taken to be 1)
##
##
##
       Null deviance: 123333
                               on 224
                                       degrees of freedom
## Residual deviance: 54487
                               on 148
                                       degrees of freedom
   AIC: 56348
##
## Number of Fisher Scoring iterations: 6
```

```
detach(data)
# AIC
AIC(model1A)
## [1] 125041.1
AIC(model2A)
## [1] 90483.73
AIC(model3A)
## [1] 90905
AIC(model4A)
## [1] 56347.6
# BIC
model1A$deviance+model1A$rank*log(length(data$mystops))
## [1] 123337.9
model2A$deviance+model2A$rank*log(length(data$mystops))
## [1] 88787.37
model3A$deviance+model3A$rank*log(length(data$mystops))
## [1] 89454.59
model4A$deviance+model4A$rank*log(length(data$mystops))
## [1] 54904.03
Based on aic and bic, I will select the last model with both precinct and ethnicity as predictors.
#summary(model4A)
predict(model4A, newdata = data.frame(myeth = 1, myprecinct = 3),type="response")
##
## 851.6685
predict(model4A, newdata = data.frame(myeth = 3, myprecinct = 3),type="response")
##
         1
## 207.041
predict(model4A, newdata = data.frame(myeth = 1, myprecinct = 1),type="response")
## 204.5492
predict(model4A, newdata = data.frame(myeth = 3, myprecinct = 1),type="response")
##
          1
## 49.72599
```

For precinct 3, the blacks are expected to stop 851.6685 times but whites 207.041 times; for precinct 1, the blacks are expected to stop 204.5492 times but whites 49.72599 times.

Question B

myarrests1_white = 381
myarrests3_black = 2188
myarrests3_white = 1238

```
attach(data)
model1B <- glm(mystops ~ 1,family=poisson(link = "log"),</pre>
                offset=log(myarrests))
model2B <- glm(mystops ~ factor(myeth), family=poisson(link = "log"),</pre>
                offset=log(myarrests))
model3B <- glm(mystops ~ factor(myprecinct), family=poisson(link = "log"),</pre>
                offset=log(myarrests))
model4B <- glm(mystops ~ factor(myeth)+factor(myprecinct),</pre>
                family=poisson(link = "log"), offset=log(myarrests))
detach(data)
# AIC
AIC(model1B)
## [1] 47828.87
AIC(model2B)
## [1] 47149.97
AIC(model3B)
## [1] 7752.906
AIC(model4B)
## [1] 5287.752
# BIC
model1B$deviance+model1B$rank*log(length(data$mystops))
## [1] 46125.68
model2B$deviance+model2B$rank*log(length(data$mystops))
## [1] 45453.6
model3B$deviance+model3B$rank*log(length(data$mystops))
## [1] 6302.501
model4B$deviance+model4B$rank*log(length(data$mystops))
## [1] 3844.179
Based on aic and bic, I will select the last model with both precinct and ethnicity as predictors. The model
with arrest as baseline will be more preferrable because it has lower aic and bic.
#summary(model4B)
myarrests1_black = 980
```

```
predict(model4B, newdata =
          data.frame(myeth = 1, myprecinct = 3, myarrests = myarrests3_black),
        type="response")
##
          1
## 964.7125
predict(model4B, newdata =
          data.frame(myeth = 3, myprecinct = 3, myarrests = myarrests3_white),
        type="response")
##
## 359.0057
predict(model4B, newdata =
          data.frame(myeth = 1, myprecinct = 1, myarrests = myarrests1_black),
        type="response")
##
## 246.8262
predict(model4B, newdata =
          data.frame(myeth = 3, myprecinct = 1, myarrests = myarrests1_white),
        type="response")
          1
## 63.11321
```

For precinct 3, the blacks are expected to stop 964.7125 times but whites 359.0057 times; for precinct 1, the blacks are expected to stop 246.8262 times but whites 63.11321 times.

Question C

```
summary(model4B)
##
## Call:
## glm(formula = mystops ~ factor(myeth) + factor(myprecinct), family = poisson(link = "log"),
      offset = log(myarrests))
##
##
## Deviance Residuals:
       Min
                  1Q
                        Median
                                      3Q
                                               Max
                                           10.4185
## -11.1396 -3.0895
                       -0.1934
                                  2.0988
## Coefficients:
                        Estimate Std. Error z value Pr(>|z|)
##
## (Intercept)
                       -1.378868
                                   0.051019 -27.027 < 2e-16 ***
## factor(myeth)2
                        0.010188
                                   0.006802
                                             1.498 0.134190
## factor(myeth)3
                                   0.009435 -44.409 < 2e-16 ***
                       -0.419001
## factor(myprecinct)2 -0.149050
                                   0.074030 -2.013 0.044077 *
## factor(myprecinct)3
                       0.559955
                                   0.056758
                                             9.866 < 2e-16 ***
                       1.210636
## factor(myprecinct)4
                                   0.057549 21.037 < 2e-16 ***
## factor(myprecinct)5 0.282865
                                   0.056794
                                             4.981 6.34e-07 ***
## factor(myprecinct)6
                       1.144204
                                   0.058047 19.712 < 2e-16 ***
## factor(myprecinct)7
                        0.218173
                                   0.064335
                                             3.391 0.000696 ***
## factor(myprecinct)8 -0.390565
                                   0.056868 -6.868 6.51e-12 ***
```

```
## factor(myprecinct)9
                          0.485112
                                      0.078151
                                                 6.207 5.39e-10 ***
## factor(myprecinct)10
                          0.417068
                                      0.058851
                                                 7.087 1.37e-12 ***
## factor(myprecinct)11
                          0.654417
                                      0.061586
                                                10.626
                                                        < 2e-16 ***
## factor(myprecinct)12
                                                18.811
                                                        < 2e-16 ***
                          1.148698
                                      0.061067
## factor(myprecinct)13
                          1.053509
                                      0.055250
                                                19.068
                                                        < 2e-16
                                                10.444
## factor(myprecinct)14
                          0.614115
                                      0.058803
                                                        < 2e-16 ***
## factor(myprecinct)15
                          1.054904
                                      0.054956
                                                19.195
                                                        < 2e-16 ***
## factor(myprecinct)16
                          0.797715
                                      0.060290
                                                13.231
                                                        < 2e-16 ***
## factor(myprecinct)17 -0.049312
                                      0.060478
                                                -0.815 0.414864
## factor(myprecinct)18
                          0.131645
                                      0.054981
                                                 2.394 0.016649 *
## factor(myprecinct)19
                          0.319164
                                      0.057999
                                                 5.503 3.74e-08 ***
                                                -0.713 0.476016
## factor(myprecinct)20 -0.040574
                                      0.056928
## factor(myprecinct)21
                                      0.056805
                                                 7.235 4.65e-13 ***
                          0.410988
                                                22.683
## factor(myprecinct)22
                          1.211227
                                      0.053399
                                                        < 2e-16 ***
                                                10.895
## factor(myprecinct)23
                          0.599919
                                      0.055064
                                                        < 2e-16 ***
## factor(myprecinct)24
                          1.319454
                                      0.054600
                                                24.166
                                                        < 2e-16 ***
## factor(myprecinct)25
                          0.913359
                                      0.053596
                                                17.041
                                                        < 2e-16 ***
## factor(myprecinct)26 -0.147614
                                      0.057006
                                                -2.589 0.009612 **
                                                34.052
## factor(myprecinct)27
                          1.895485
                                      0.055664
                                                        < 2e-16 ***
## factor(myprecinct)28 -0.764964
                                      0.060915
                                               -12.558
                                                        < 2e-16
## factor(myprecinct)29
                          1.124710
                                      0.054267
                                                20.726
                                                        < 2e-16 ***
## factor(myprecinct)30
                                                 9.475
                                                        < 2e-16 ***
                          0.524652
                                      0.055374
                                                29.368
                                                        < 2e-16 ***
## factor(myprecinct)31
                          1.649498
                                      0.056167
                                                23.229
## factor(myprecinct)32
                          1.386276
                                      0.059679
                                                        < 2e-16 ***
## factor(myprecinct)33
                          1.083192
                                      0.054214
                                                19.980
                                                        < 2e-16 ***
## factor(myprecinct)34
                          1.518972
                                      0.054355
                                                27.945
                                                        < 2e-16 ***
## factor(myprecinct)35
                                                13.917
                                                        < 2e-16 ***
                          0.879407
                                      0.063190
## factor(myprecinct)36
                          1.616306
                                      0.058796
                                                27.490
                                                        < 2e-16 ***
                                                23.487
## factor(myprecinct)37
                          1.409430
                                      0.060008
                                                        < 2e-16 ***
## factor(myprecinct)38
                          1.763813
                                      0.056195
                                                31.388
                                                        < 2e-16 ***
## factor(myprecinct)39
                          0.501081
                                      0.054841
                                                 9.137
                                                        < 2e-16 ***
## factor(myprecinct)40
                          1.531984
                                      0.061467
                                                24.924
                                                        < 2e-16 ***
## factor(myprecinct)41
                          1.913898
                                      0.055716
                                                34.351
                                                        < 2e-16 ***
                                                19.890
## factor(myprecinct)42
                          1.084217
                                      0.054511
                                                        < 2e-16 ***
## factor(myprecinct)43
                                      0.056645
                                                 9.565
                                                        < 2e-16
                          0.541787
                                                15.582
## factor(myprecinct)44
                          0.883038
                                      0.056671
                                                        < 2e-16 ***
## factor(myprecinct)45
                          0.838439
                                      0.054215
                                                15.465
                                                        < 2e-16 ***
## factor(myprecinct)46
                                      0.053750
                                                12.202
                                                        < 2e-16 ***
                          0.655855
## factor(myprecinct)47
                                      0.059981
                                                18.808
                                                        < 2e-16 ***
                          1.128144
                                                 7.239 4.51e-13 ***
## factor(myprecinct)48
                          0.411880
                                      0.056895
## factor(myprecinct)49
                          1.101219
                                      0.059681
                                                18.452
                                                        < 2e-16 ***
## factor(myprecinct)50
                                                16.241
                                                        < 2e-16 ***
                          0.878797
                                      0.054109
## factor(myprecinct)51
                          0.348980
                                      0.058550
                                                 5.960 2.52e-09 ***
## factor(myprecinct)52
                                                 8.870
                                                        < 2e-16 ***
                          0.491898
                                      0.055458
## factor(myprecinct)53
                          0.599687
                                      0.058486
                                                10.254
                                                        < 2e-16 ***
                                                 8.192 2.58e-16 ***
## factor(myprecinct)54
                          0.491840
                                      0.060042
## factor(myprecinct)55
                          0.497511
                                      0.059023
                                                 8.429
                                                        < 2e-16 ***
                                                13.502
## factor(myprecinct)56
                          0.890877
                                      0.065982
                                                        < 2e-16 ***
## factor(myprecinct)57
                          1.532782
                                      0.061366
                                                24.978
                                                        < 2e-16 ***
## factor(myprecinct)58
                          1.578846
                                      0.054528
                                                28.955
                                                        < 2e-16
                          1.083726
                                                18.393
## factor(myprecinct)59
                                      0.058920
                                                        < 2e-16 ***
## factor(myprecinct)60
                          0.833828
                                      0.054216
                                                15.380
                                                        < 2e-16 ***
## factor(myprecinct)61
                          1.277336
                                      0.056757
                                                22.506
                                                        < 2e-16 ***
## factor(myprecinct)62
                         1.206378
                                      0.056666
                                                21.289
                                                        < 2e-16 ***
```

```
## factor(myprecinct)63 1.308782
                                    0.058301
                                              22.449
                                                      < 2e-16 ***
## factor(myprecinct)64
                                              29.642 < 2e-16 ***
                         1.712497
                                    0.057772
## factor(myprecinct)65
                        1.899204
                                    0.055154
                                              34.434
                                                      < 2e-16 ***
## factor(myprecinct)66
                         2.102128
                                    0.054231
                                              38.763
                                                      < 2e-16 ***
## factor(myprecinct)67
                         1.202841
                                    0.054957
                                              21.887
                                                      < 2e-16 ***
## factor(myprecinct)68 2.201257
                                    0.059245
                                              37.155
                                                      < 2e-16 ***
## factor(myprecinct)69
                         1.720700
                                    0.058227
                                              29.551
                                                      < 2e-16 ***
## factor(myprecinct)70
                         1.032004
                                    0.054813
                                              18.828
                                                      < 2e-16 ***
## factor(myprecinct)71
                         1.479415
                                    0.054239
                                              27.276
                                                      < 2e-16 ***
## factor(myprecinct)72
                        1.464985
                                    0.053737
                                              27.262
                                                      < 2e-16 ***
## factor(myprecinct)73
                         0.991018
                                    0.053585
                                              18.494
                                                      < 2e-16 ***
## factor(myprecinct)74
                                              19.845
                                                      < 2e-16 ***
                         1.151460
                                    0.058023
## factor(myprecinct)75
                        1.571225
                                    0.075731
                                              20.747
                                                      < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
##
  (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 46120.3 on 224
                                      degrees of freedom
## Residual deviance: 3427.1
                               on 148
                                       degrees of freedom
## AIC: 5287.8
##
## Number of Fisher Scoring iterations: 4
\exp(-0.419001)
```

[1] 0.6577035

Based on the coefficients of factor(myeth)3 above, yes, there is a significant difference in number of stops given by the police based on race. The expected counts for white are 65.77035% of those for blacks.