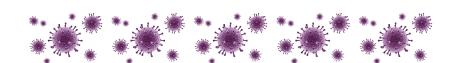
# Modèles Linéaires Appliqués / Régression GLM & Résultats Non-Asymptotiques

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**UQAM** 

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#### With ChainLadder package, cumulated payments

```
> library(ChainLadder)
     data(GenIns)
    round (GenIns/1000)
4
5
          dev
                   2
                         3
                                      5
                                            6
                                                   7
                                                         8
                                                               9
                                                                     10
  orig
                     1735
                                  2746
                                        3320
          358
               1125
                            2218
                                               3466
                                                     3606
                                                            3834
                                                                  3901
               1236
                     2170
                            3353
                                  3799
                                               4648
          352
                                        4120
                                                     4914
                                                            5339
                                                                     NA
8
      3
          291
               1292 2219
                            3235
                                  3986
                                        4133
                                               4629
                                                     4909
                                                              NΑ
                                                                     NA
9
                     2195
                            3757
                                                                     NΑ
      4
          311
               1419
                                  4030
                                        4382
                                               4588
                                                        NΑ
                                                              NΑ
          443
               1136
                     2128
                            2898
                                  3403
                                        3873
                                                 NA
                                                        NA
                                                              NΑ
                                                                     NA
                     2181
                                                                     NΑ
          396
               1333
                            2986
                                  3692
                                           NΑ
                                                 NΑ
                                                        NA
                                                              NΑ
12
               1288
                     2420
                                     NΑ
                                                                     NΑ
          441
                            3483
                                           NΑ
                                                 NΑ
                                                        NA
                                                              NΑ
13
      8
          359
               1421
                     2864
                              NΑ
                                     NΑ
                                           NΑ
                                                 NA
                                                        NA
                                                              NΑ
                                                                     NA
14
      9
          377
               1363
                        NΑ
                              NΑ
                                     NΑ
                                           NΑ
                                                 NΑ
                                                        NA
                                                              NΑ
                                                                     NΑ
15
     10
          344
                 NA
                        NΑ
                              NA
                                     NA
                                           NA
                                                 NA
                                                        NA
                                                              NA
                                                                     ΝA
16
```

Or incremental payments (row = accident year)

```
> Y=cum2incr(GenIns)
2
          dev
                          3
  origin
             1
                    2
                                4
                                     5
                                          6
                                                7
                                                            10
           358
                 767
                       611
                              483 527 574
                                             146
                                                  140
           352
                 884
                        934
                             1183
                                   446
                                        321
                                             528
                                                  266
                                                       425
6
           291
                1002
                       926
                             1017
                                   751
                                        147
                                             496
                                                  280
                                                            NΑ
7
       4
           311
                1108
                       776
                             1562
                                   272
                                        352
                                             206
                                                   NΑ
                                                        NΑ
                                                           ΝA
8
9
       5
           443
                 693
                       992
                              769
                                   505
                                        471
                                              NΑ
                                                   NΑ
                                                        NA NA
           396
                 937
                       847
                              805
                                   706
                                                           ΝA
10
       6
                                         ΝA
                                              ΝA
                                                   NΑ
                                                        NΑ
                 848
                      1131
                             1063
                                    NΑ
                                                   NΑ
                                                           NΑ
           441
                                         NA
                                              NA
                                                        ΝA
                1062
       8
           359
                      1443
                               NΑ
                                    NΑ
                                         NΑ
                                              NΑ
                                                   NΑ
                                                        NA NA
12
       9
                         NA
                                    NΑ
                                                           NΑ
           377
                 987
                               NA
                                         NΑ
                                              NA
                                                   NΑ
                                                        NΑ
      10
           344
                   NΑ
                         NΑ
                               NΑ
                                    NA
                                         NΑ
                                              NΑ
                                                   NΑ
                                                        NA NA
14
```

Classical model,  $Y_{i,j} \sim \mathcal{P}(L_i C_j)$ , multiplicatif ligne-colonne

```
> base = data.frame(Y=as.vector(Y),origin=1:10,dev=rep
      (1:10, each=10))
2 > reg = glm(Y ~ as.factor(origin)+as.factor(dev),data=
      base, family=poisson)
3 > matrix(predict(reg,newdata=base,type="response")
      ,10,10)
       [,1] [,2]
                  [,3] [,4]
                             [,5]
                                   [,6]
                                        [,7]
                                              [8,]
                                                   [,9]
                                                         ,10]
4
  [1,] 270
              673
                  704 753
                              417
                                    293
                                         268
                                               182
                                                    273
                                                           68
6 [2,] 376
             937
                   981 1049
                              581
                                    407
                                         374
                                               254
                                                    380
                                                           95
7 [3,]
                                                           94
       372
             927
                  971 1039
                              575
                                    403
                                         370
                                               251
                                                    376
8 [4,]
       367
              913
                   957
                        1023
                              567
                                    397
                                         364
                                                    370
                                                           92
                                               247
9 [5,]
       336
             838
                  877
                        938
                              520
                                    364
                                         334
                                               227
                                                    339
                                                           85
  [6,]
        354
              881
                   923
                         987
                              547
                                    383
                                         352
                                               238
                                                    357
                                                           89
  [7,]
        392
              976
                  1022 1093
                              606
                                    425
                                         389
                                               264
                                                    396
                                                           99
  [8,]
        470
             1170
                  1225 1310
                              726
                                    509
                                         467
                                               317
                                                    474
                                                         118
13 [9,]
        391
              973
                  1019
                       1090
                              604
                                    423
                                         388
                                               263
                                                    394
                                                           98
14 10,]
        344
              857
                   897
                         960
                              532
                                    373
                                               232
                                                           87
                                         342
                                                    347
```

```
1 > passe = which(!is.na(base$Y))
2 > futur = which(is.na(base$Y))
> sum(predict(reg,newdata=base,"response")[futur])
 [1] 18680
```

On peut récupérer les résidus (de Pearson) sur la partie observée

Pour rappel

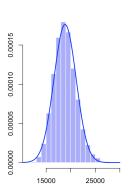
$$\widehat{\varepsilon}_{i,j} = \frac{y_{i,j} - \widehat{\mu}_{i,j}}{\sqrt{\widehat{\mu}_{i,j}}} \text{ ou } y_{i,j} = \widehat{\mu}_{i,j} + \sqrt{\widehat{\mu}_{i,j}} \ \widehat{\varepsilon}_{i,j}$$

On peut alors créer des pseudo-observations par boostrap

$$y_{i,j}^{(b)} = \widehat{\mu}_{i,j} + \sqrt{\widehat{\mu}_{i,j}} \ \widehat{\varepsilon}_{i,j}^{(b)}$$



```
_{1} > R = rep(NA, 9999)
2 > for(b in 1:9999){
3 L = predict(reg,type="response")
4 n = length(L)
5 bases = base
6 epsilon = residuals(reg,type="pearson")
7 \text{ bases} \$ Ys = NA
8 bases$Ys[passe] = L + sqrt(L)*epsilon[
      sample(1:n,size=n,replace=TRUE)]
9 bases$Ys[bases$Ys<0]=0
regs = glm(Ys ~ as.factor(origin)+as.
      factor(dev), data=bases, family=
      poisson)
11 R[b] = sum(predict(regs,newdata=base,"
      response")[futur]) }
```



On visualise la distribution de

$$\widehat{R} = \sum_{(i,i) \text{ futur}} \widehat{\mu}_{i,j}$$