

EXAMEN INTRA, ACT2040, 2013  
- annexes -

Dans ce document figurent des sorties obtenues à partir de la base de données suivantes,

```
> base=read.table("http://freakonometrics.free.fr/baseaffairs.txt",header=TRUE)
> tail(base)
  SEX AGE YEARMARRIAGE CHILDREN RELIGIOUS EDUCATION OCCUPATION SATISFACTION Y
596  1  47          15.0         1         3          16           4          2  7
597  1  22           1.5         1         1          12           2          5  1
598  0  32          10.0         1         2          18           5          4  6
599  1  32          10.0         1         2          17           6          5  2
600  1  22           7.0         1         3          18           6          2  2
601  0  32          15.0         1         3          14           1          5  1
```

Il s'agit d'une base construite à partir des données de l'article *A Theory of Extramarital Affairs*, de Ray Fair, paru en 1978 dans *Journal of Political Economy*, avec 563 observations.

- Y: nombre d'aventures extra-conjugales hétérosexuelles pendant l'année passée
- SEX: 0 pour une femme, et 1 pour un homme
- AGE: âge de la personne interrogée
- YEARMARRIAGE: nombre d'années de mariage
- CHILDREN: 0 si la personne n'a pas d'enfants (avec son épouse) et 1 si elle en a
- RELIGIOUS: degré de "religiosité", entre 1 (anti-religieuse) à 5 (très religieuse)
- EDUCATION: nombre d'années d'éducation, 9=grade school, 12=high school, à 20=PhD
- OCCUPATION: construit suivant l'échelle d'Hollingshead
  - Higher executives of large concerns, proprietors, and major professionals (1)
  - Business managers, proprietors of medium-sized businesses, and lesser professionals (2)
  - Administrative personnel, owners of small businesses, and minor professionals (3)
  - Clerical and sales workers, technicians, and owners of little businesses (4)
  - Skilled manual employees (5)
  - Machine operators and semiskilled employees (6)
  - Unskilled employees (7)
- SATISFACTION: perception de son mariage, de très mécontente (1) à très contente (5)

Afin de faciliter l'analyse, deux variables ont été créées,

- ENFANTS: OUI si la personne en a, NON sinon
- SEXE: F pour une femme, et H pour un homme

```
> base$SEXE="H"
> base$SEXE[base$SEX=="0"]="F"
> base$SEXE=as.factor(base$SEXE)
> table(base$SEXE)
```

```
F H
295 268
```

```
> base$ENFANT="OUI"
> base$ENFANT[base$CHILDREN==0]="NON"
> base$ENFANT=as.factor(base$ENFANT)
> table(base$ENFANT)
```

```
NON OUI
164 399
> table(base$CHILDREN)
```

```
0 1
164 399
```

#### Sortie 1

```
> nrow(base)
[1] 563
> mean(base$Y)
[1] 0.6305506
> table(base$Y)
```

```
0 1 2 3 4 5 6 7 8 10
451 34 17 19 12 11 11 5 2 1
```

```
> base$Y0=(base$Y>0)
> table(base$Y0)
```

```
FALSE TRUE
451 112
```

#### Sortie 2

```
> regbernoulli = glm(Y0~0+YEARMARRIAGE+SEXE,data=base,
+ family=binomial(link="logit"))
> summary(regbernoulli)
```

```
Call:
glm(formula = Y0 ~ 0 + YEARMARRIAGE + SEXE, family = binomial(link =
"logit"),
    data = base)
```

```
Coefficients:
              Estimate Std. Error z value Pr(>|z|)
YEARMARRIAGE  0.03738    0.01911   1.957  0.0504 .
SEXEF        -1.84763    0.22411  -8.244 < 2e-16 ***
SEXEH        -1.55898    0.22281  -6.997 2.62e-12 ***
---
```

```
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

(Dispersion parameter for binomial family taken to be 1)

Null deviance: 780.48 on 563 degrees of freedom  
Residual deviance: 555.94 on 560 degrees of freedom  
AIC: 561.94

Number of Fisher Scoring iterations: 4

```
> regpoisson = glm(Y~0+YEARMARRIAGE+SEXE,data=base,  
+ family=poisson(link="log"))  
> summary(regpoisson)
```

Call:

```
glm(formula = Y ~ 0 + YEARMARRIAGE + SEXE, family = poisson(link =  
"log"),  
data = base)
```

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
YEARMARRIAGE	0.044486	0.009633	4.618	3.88e-06 ***
SEXE	-0.947094	0.117609	-8.053	8.08e-16 ***
SEXE	-0.746552	0.116919	-6.385	1.71e-10 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 1383.8 on 563 degrees of freedom  
Residual deviance: 1269.6 on 560 degrees of freedom  
AIC: 1593.6

Number of Fisher Scoring iterations: 6

### Sortie 3

```
> regpoisson2 = glm(Y~ENFANT+YEARMARRIAGE+SEXE+AGE+RELIGIOUS+  
+ SATISFACTION+EDUCATION,data=base,family=poisson(link="log"))  
> summary(regpoisson2)
```

Call:

```
glm(formula = Y ~ ENFANT + YEARMARRIAGE + SEXE + AGE + RELIGIOUS +  
SATISFACTION + EDUCATION, family = poisson(link = "log"),  
data = base)
```

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
(Intercept)	-0.119541	0.501611	-0.238	0.81164
ENFANTOUI	0.486828	0.170638	2.853	0.00433 **
YEARMARRIAGE	0.074466	0.017126	4.348	1.37e-05 ***
SEXE	0.059154	0.122693	0.482	0.62972
AGE	-0.040471	0.009899	-4.088	4.35e-05 ***
RELIGIOUS	-0.254586	0.048492	-5.250	1.52e-07 ***
SATISFACTION	-0.363964	0.045780	-7.950	1.86e-15 ***
EDUCATION	0.124790	0.026270	4.750	2.03e-06 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 1295.2 on 562 degrees of freedom  
Residual deviance: 1133.0 on 555 degrees of freedom  
AIC: 1467.1

Number of Fisher Scoring iterations: 6

### Sortie 4

```
> regpoisson2b = glm(Y~0+YEARMARRIAGE+AGE+RELIGIOUS+SATISFACTION+  
+ EDUCATION,data=base,family=poisson(link="log"))  
> summary(regpoisson2b)
```

Call:

```
glm(formula = Y ~ 0 + YEARMARRIAGE + AGE + RELIGIOUS + SATISFACTION +  
EDUCATION, family = poisson(link = "log"), data = base)
```

Deviance Residuals:

Min	1Q	Median	3Q	Max
-2.7593	-1.1327	-0.8639	-0.6079	5.8815

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
YEARMARRIAGE	0.093324	0.015403	6.059	1.37e-09 ***
AGE	-0.040267	0.009197	-4.378	1.20e-05 ***
RELIGIOUS	-0.250055	0.046962	-5.325	1.01e-07 ***
SATISFACTION	-0.376590	0.043512	-8.655	< 2e-16 ***
EDUCATION	0.134005	0.016405	8.169	3.12e-16 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 1383.8 on 563 degrees of freedom  
Residual deviance: 1142.1 on 558 degrees of freedom  
AIC: 1470.2

Number of Fisher Scoring iterations: 6

#### Sortie 5

```
> regpoisson3=glm(Y~0+YEARMARRIAGE+AGE+RELIGIOUS+  
+ as.factor(SATISFACTION)+EDUCATION,data=base,  
+ family=poisson(link="log"))  
> summary(regpoisson3)
```

```
Call:  
glm(formula = Y ~ 0 + YEARMARRIAGE + AGE + RELIGIOUS +  
as.factor(SATISFACTION) +  
EDUCATION, family = poisson(link = "log"), data = base)
```

Deviance Residuals:

Min	1Q	Median	3Q	Max
-2.7344	-1.1741	-0.8139	-0.5244	5.4286

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
YEARMARRIAGE	0.088831	0.015735	5.645	1.65e-08 ***
AGE	-0.041553	0.009784	-4.247	2.17e-05 ***
RELIGIOUS	-0.247346	0.048498	-5.100	3.39e-07 ***
as.factor(SATISFACTION)1	-0.593474	0.506405	-1.172	0.2412
as.factor(SATISFACTION)2	-0.360428	0.451006	-0.799	0.4242
as.factor(SATISFACTION)3	-0.852263	0.453104	-1.881	0.0600 .
as.factor(SATISFACTION)4	-0.906171	0.453866	-1.997	0.0459 *
as.factor(SATISFACTION)5	-1.937049	0.453124	-4.275	1.91e-05 ***
EDUCATION	0.118942	0.023497	5.062	4.15e-07 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 1383.8 on 563 degrees of freedom  
Residual deviance: 1117.8 on 554 degrees of freedom  
AIC: 1453.9

Number of Fisher Scoring iterations: 6

#### Sortie 6

```
> regqpoisson = glm(Y~0+YEARMARRIAGE+AGE+RELIGIOUS+SATISFACTION+  
+ EDUCATION,data=base,family=quasipoisson(link="log"))  
> summary(regqpoisson)
```

```
Call:  
glm(formula = Y ~ 0 + YEARMARRIAGE + AGE + RELIGIOUS + SATISFACTION +  
EDUCATION, family = quasipoisson(link = "log"), data = base)
```

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
YEARMARRIAGE	0.09332	0.02893	3.225	0.00133 **
AGE	-0.04027	0.01728	-2.331	0.02012 *
RELIGIOUS	-0.25005	0.08822	-2.835	0.00476 **
SATISFACTION	-0.37659	0.08174	-4.607	5.06e-06 ***
EDUCATION	0.13400	0.03082	4.349	1.63e-05 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for quasipoisson family taken to be 3.528555)

Null deviance: 1383.8 on 563 degrees of freedom  
Residual deviance: 1142.1 on 558 degrees of freedom  
AIC: NA

Number of Fisher Scoring iterations: 6

```
> library(MASS)  
> regnegbin = glm.nb(Y~0+YEARMARRIAGE+AGE+RELIGIOUS+  
+ SATISFACTION+EDUCATION,data=base)  
> summary(regnegbin)
```

```
Call:  
glm.nb(formula = Y ~ 0 + YEARMARRIAGE + AGE + RELIGIOUS + SATISFACTION  
+  
EDUCATION, data = base, init.theta = 0.1609544585, link = log)
```

Deviance Residuals:

Min	1Q	Median	3Q	Max
-1.0509	-0.7150	-0.5972	-0.4699	2.1926

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
--	----------	------------	---------	----------

```

YEARMARRIAGE 0.10588 0.03563 2.971 0.002967 **
AGE -0.04584 0.02060 -2.226 0.026045 *
RELIGIOUS -0.24616 0.10614 -2.319 0.020386 *
SATISFACTION -0.44546 0.10813 -4.120 3.79e-05 ***
EDUCATION 0.15312 0.03938 3.888 0.000101 ***

```

```

---
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

```

(Dispersion parameter for Negative Binomial(0.161) family taken to be 1)

```

Null deviance: 327.60 on 563 degrees of freedom
Residual deviance: 279.45 on 558 degrees of freedom
AIC: 1001.5

```

Number of Fisher Scoring iterations: 1

```

Theta: 0.1610
Std. Err.: 0.0232

```

2 x log-likelihood: -989.5430

#### Sortie 7

```

> library(psc1)
> regzeroinfl1=zeroinfl(Y~0+YEARMARRIAGE+AGE+RELIGIOUS+
+ SATISFACTION+EDUCATION|1,dist="poisson",link="logit",data=base)
> summary(regzeroinfl1)

```

```

Call:
zeroinfl(formula = Y ~ 0 + YEARMARRIAGE + AGE + RELIGIOUS +
SATISFACTION + EDUCATION | 1, data = base, dist = "poisson", link =
"logit")

```

```

Pearson residuals:
  Min      1Q  Median      3Q      Max
-0.4865 -0.4430 -0.4214 -0.3923  7.2787

```

```

Count model coefficients (poisson with log link):
  Estimate Std. Error z value Pr(>|z|)
YEARMARRIAGE 0.04366 0.01880 2.322 0.0202 *
AGE -0.01616 0.01060 -1.525 0.1274
RELIGIOUS -0.07624 0.05110 -1.492 0.1357
SATISFACTION -0.10319 0.05075 -2.034 0.0420 *
EDUCATION 0.10641 0.01886 5.641 1.69e-08 ***

```

```

Zero-inflation model coefficients (binomial with logit link):
  Estimate Std. Error z value Pr(>|z|)
(Intercept) 1.2531 0.1129 11.1 <2e-16 ***

```

```

---
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

```

```

Number of iterations in BFGS optimization: 12
Log-likelihood: -499.1 on 6 Df

```

```

> regzeroinfl2=zeroinfl(Y~0+YEARMARRIAGE+AGE+RELIGIOUS+
+ EDUCATION | 0+SATISFACTION,dist="poisson",link="logit",data=base)
> summary(regzeroinfl2)

```

```

Call:
zeroinfl(formula = Y ~ 0 + YEARMARRIAGE + AGE + RELIGIOUS + EDUCATION |
0 + SATISFACTION, data = base, dist = "poisson", link = "logit")

```

```

Pearson residuals:
  Min      1Q  Median      3Q      Max
-0.6811 -0.4340 -0.3697 -0.3402  6.5232

```

```

Count model coefficients (poisson with log link):
  Estimate Std. Error z value Pr(>|z|)
YEARMARRIAGE 0.04488 0.01836 2.444 0.0145 *
AGE -0.01810 0.01045 -1.733 0.0832 .
RELIGIOUS -0.09250 0.04935 -1.874 0.0609 .
EDUCATION 0.09169 0.01694 5.412 6.25e-08 ***

```

```

Zero-inflation model coefficients (binomial with logit link):
  Estimate Std. Error z value Pr(>|z|)
SATISFACTION 0.33689 0.02842 11.85 <2e-16 ***

```

```

---
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

```

```

Number of iterations in BFGS optimization: 14
Log-likelihood: -492.2 on 5 Df

```