

# Modelització de dades longitudinals amb efectes aleatoris de intercepció/pendent i presència de dades perdudes en el context dels estudis d'estabilitat – ANNEX 5

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M0.178 TFM-Estadística i Bioinformàtica 2

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Àrea: Bioestadística / Bioinformàtica

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Barcelona, 04 de Juny de 2019



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# Resums R dels models simple i d'interaccions de l'anàlisi pràctic LAKE1

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# 1 RESULTATS DELS MODELS SIMPLES

```
# Fit the full model
Lake1.fm0 <- lm(CargaViral ~ . - LogCargaViral - CargaViral_t - Ident, data = LAKE1)
# Stepwise regression model
Lake1.step.model0 <- stepAIC(Lake1.fm0, direction = "both",
                             trace = F)
(Lake1.step.model0s <- summary(Lake1.step.model0))
##
## Call:
## lm(formula = CargaViral ~ Tiempo + CD4P + Cloro, data = LAKE1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -113727  -55558   -7185   42815  276156
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   910289     478303   1.903  0.0650 .
## Tiempo        -1868         958  -1.950  0.0591 .
## CD4P          -4985         2505  -1.990  0.0542 .
## Cloro         -6948         4748  -1.463  0.1521
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## s: 81390 on 36 degrees of freedom
## Multiple R-squared:  0.4226,
## Adjusted R-squared:  0.3745
## F-statistic: 8.783 on 3 and 36 DF,  p-value: 0.0001673
anova(Lake1.step.model0)
```

	Df	Sum Sq	Mean Sq	F value	Pr(>F)
	<int>	<dbl>	<dbl>	<dbl>	<dbl>
Tiempo	1	119689303289	119689303289	18.069892	0.0001440645
CD4P	1	40649071089	40649071089	6.136926	0.0180686480
Cloro	1	14180720145	14180720145	2.140911	0.1520937398
Residuals	36	238452714894	6623686525	NA	NA

4 rows

```
# Fit the full model
Lake1.fm1 <- lm(LogCargaViral ~ . - CargaViral - CargaViral_t - Ident, data = LAKE1)
# Stepwise regression model
Lake1.step.model1 <- stepAIC(Lake1.fm1, direction = "both",
                             trace = F)
(Lake1.step.model1s <- summary(Lake1.step.model1))
##
## Call:
## lm(formula = LogCargaViral ~ Tiempo, data = LAKE1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
##  -3.4563  -1.6775  -0.0412   1.6012   4.3657
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   8.7566     0.5966  14.678 < 2e-16 ***
## Tiempo       -0.1343     0.0203  -6.616 8.16e-08 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```

##
## s: 2.178 on 38 degrees of freedom
## Multiple R-squared: 0.5353,
## Adjusted R-squared: 0.5231
## F-statistic: 43.78 on 1 and 38 DF, p-value: 8.162e-08
# Fit the full model
Lake1.fm2 <- lm(CargaViral_t ~ . - CargaViral - LogCargaViral - Ident, data = LAKE1)
# Stepwise regression model
Lake1.step.model2 <- stepAIC(Lake1.fm2, direction = "both",
                             trace = F)
(Lake1.step.model2s <- summary(Lake1.step.model2))
##
## Call:
## lm(formula = CargaViral_t ~ Tiempo, data = LAKE1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -647.6 -238.6   11.4  272.2  352.4
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 7834.432     81.191  96.494 < 2e-16 ***
## Tiempo      -21.784       2.762  -7.887 1.61e-09 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## s: 296.5 on 38 degrees of freedom
## Multiple R-squared: 0.6208,
## Adjusted R-squared: 0.6108
## F-statistic: 62.2 on 1 and 38 DF, p-value: 1.606e-09

```

## 2 RESULTATS DELS MODELS AMB INTERACCIONS

```
#Original
Inter.0 <- attr(Lake1.step.model0s$terms,"term.labels")
Lake1.step.model0int.s <- summary(Lake1.step.model0int <- update(Lake1.step.model0,paste(".", ~ .
+",paste(Inter.0,collapse="*"),sep=" "))
(Lake1.step.model0int2.s2 <- summary(Lake1.step.model0int2 <- stepAIC(Lake1.step.model0int,
direction = "both", trace = F)))
##
## Call:
## lm(formula = CargaViral ~ Tiempo + CD4P + Cloro + Tiempo:CD4P +
##     Tiempo:Cloro + CD4P:Cloro + Tiempo:CD4P:Cloro, data = LAKE1)
##
## Residuals:
##     Min       1Q   Median       3Q      Max
## -73263 -18903  -1618  24695 147784
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   6447992.94 1022547.10   6.306 4.49e-07 ***
## Tiempo        -176830.68   58543.48  -3.021 0.00493 **
## CD4P          -343452.68   74069.49  -4.637 5.69e-05 ***
## Cloro         -60755.43   10234.76  -5.936 1.31e-06 ***
## Tiempo:CD4P    9148.16    2830.75   3.232 0.00285 **
## Tiempo:Cloro  1649.19     574.98   2.868 0.00725 **
## CD4P:Cloro    3282.16     732.55   4.480 8.93e-05 ***
## Tiempo:CD4P:Cloro -86.72     27.74  -3.127 0.00375 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## s: 47430 on 32 degrees of freedom
## Multiple R-squared:  0.8257,
## Adjusted R-squared:  0.7875
## F-statistic: 21.65 on 7 and 32 DF,  p-value: 1.856e-10
(Lake1.step.model0int2.an2<-Anova(Lake1.step.model0int2))
```

	Sum Sq <dbl>	Df <dbl>	F value <dbl>	Pr(>F) <dbl>
Tiempo	57912478201	1	25.739390229	1.605279e-05
CD4P	18872847563	1	8.388098787	6.757372e-03
Cloro	21648029754	1	9.621537583	3.998059e-03
Tiempo:CD4P	28046007872	1	12.465139869	1.281942e-03
Tiempo:Cloro	4601747	1	0.002045261	9.642094e-01
CD4P:Cloro	23259790306	1	10.337889828	2.975084e-03
Tiempo:CD4P:Cloro	21993544225	1	9.775102619	3.750561e-03
Residuals	71998570517	32	NA	NA

8 rows

```
(Lake1.step.model0int2.an1_2<-anova(Lake1.step.model0int2,Lake1.step.model0))
```

	Res.Df <dbl>	RSS <dbl>	Df <dbl>	Sum of Sq <dbl>	F <dbl>	Pr(>F) <dbl>
1	32	71998570517	NA	NA	NA	NA
2	36	238452714894	-4	-166454144377	18.49527	5.807627e-08

2 rows

```

if (Lake1.step.model0int2.an1_2$`Pr(>F)`[2]>0.05){
  intM0 <- Lake1.step.model0
  intM0s <- Lake1.step.model0s
} else {
  intM0 <- Lake1.step.model0int2
  intM0s <- Lake1.step.model0int2.s2
}
intM0col <- Lake1.step.model0col
intM0cols <- Lake1.step.model0col.s

```

En el cas dels models transformats no seria necessari en principi ja que només ha quedat un predictor com a model òptim i per tant no té altres predictors per creuar-se. Tot i així es fa la prova on apareixen totes les variables amb interaccions per comprobar la diferència entre models:

```

#Log
#Step1
Lake1.step.modellint.s <- summary(Lake1.step.modellint <- update(Lake1.step.modell1,paste(".", ~ .
+"),paste(Inter.0,collapse="*"),sep=" "))
(Lake1.step.modellint2.s2 <- summary(Lake1.step.modellint2 <- stepAIC(Lake1.step.modellint,
direction = "both", trace = F)))
##
## Call:
## lm(formula = LogCargaViral ~ Tiempo + CD4P + Tiempo:CD4P, data = LAKE1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -3.7900 -1.0384 -0.2722  0.7064  4.2465
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 13.642765   1.468711   9.289 4.29e-11 ***
## Tiempo      -0.350318   0.069405  -5.047 1.30e-05 ***
## CD4P        -0.272305   0.078710  -3.460 0.00141 **
## Tiempo:CD4P  0.010529   0.002956   3.562 0.00106 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## s: 1.89 on 36 degrees of freedom
## Multiple R-squared:  0.6687,
## Adjusted R-squared:  0.6411
## F-statistic: 24.22 on 3 and 36 DF,  p-value: 9.352e-09
(Lake1.step.modellint2.an2<-Anova(Lake1.step.modellint2))

```

	Sum Sq <dbl>	Df <dbl>	F value <dbl>	Pr(>F) <dbl>
Tiempo	97.671197	1	27.349144	7.435470e-06
CD4P	6.459032	1	1.808609	1.870872e-01
Tiempo:CD4P	45.305808	1	12.686187	1.058997e-03
Residuals	128.565744	36	NA	NA

4 rows

```
(Lake1.step.modellint2.an1_2 <- anova(Lake1.step.modellint2,Lake1.step.modell1))
```

	Res.Df <dbl>	RSS <dbl>	Df <dbl>	Sum of Sq <dbl>	F <dbl>	Pr(>F) <dbl>
1	36	128.5657	NA	NA	NA	NA
2	38	180.3306	-2	-51.76484	7.247398	0.002264675

2 rows

```

if (Lake1.step.modellint2.an1_2$`Pr(>F)`[2]>0.05){

```

```

intM1 <- Lake1.step.model1
intM1s <- Lake1.step.model1s
} else {
  intM1 <- Lake1.step.model1int2
  intM1s <- Lake1.step.model1int2.s2
}
#Box-Cox
#Step1
Lake1.step.model2int.s <- summary(Lake1.step.model2int <- update(Lake1.step.model2,paste(".", ~ .
+",paste(Inter.0,collapse="*"),sep=" "))
(Lake1.step.model2int2.s2 <- summary(Lake1.step.model2int2 <- stepAIC(Lake1.step.model2int,
direction = "both", trace = F)))
##
## Call:
## lm(formula = CargaViral_t ~ Tiempo + CD4P + Tiempo:CD4P, data = LAKE1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -631.26 -157.19   31.58  187.95  448.34
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  8267.5540    215.9970   38.276 < 2e-16 ***
## Tiempo       -47.3143     10.2070   -4.635 4.55e-05 ***
## CD4P         -23.5364     11.5756   -2.033 0.0494 *
## Tiempo:CD4P   1.1663      0.4347    2.683 0.0110 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## s: 277.9 on 36 degrees of freedom
## Multiple R-squared:  0.6843,
## Adjusted R-squared:  0.6579
## F-statistic: 26.01 on 3 and 36 DF,  p-value: 3.979e-09
(Lake1.step.model2int2.an2<-Anova(Lake1.step.model2int2))

```

	Sum Sq <dbl>	Df <dbl>	F value <dbl>	Pr(>F) <dbl>
Tiempo	3308923.010	1	42.83920038	1.306654e-07
CD4P	3352.261	1	0.04340027	8.361476e-01
Tiempo:CD4P	555922.233	1	7.19728559	1.095743e-02
Residuals	2780659.473	36	NA	NA

4 rows

```
(Lake1.step.model2int2.an1_2 <- anova(Lake1.step.model2int2,Lake1.step.model2))
```

	Res.Df <dbl>	RSS <dbl>	Df <dbl>	Sum of Sq <dbl>	F <dbl>	Pr(>F) <dbl>
1	36	2780659	NA	NA	NA	NA
2	38	3339934	-2	-559274.5	3.620343	0.03692995

2 rows

```

if (Lake1.step.model2int2.an1_2$`Pr(>F)`[2]>0.05){
  intM2 <- Lake1.step.model2
  intM2s <- Lake1.step.model2s
} else {
  intM2 <- Lake1.step.model2int2
  intM2s <- Lake1.step.model2int2.s2
}

```