## → A5-Regresión logística

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```
1 # Leyendo librerias
2 install.packages("ISLR")
3 install.packages("tidyverse")
4 install.packages("VCD")
5 install.packages("mosaic")
   Installing package into '/usr/local/lib/R/site-library'
   (as 'lib' is unspecified)
   Installing package into '/usr/local/lib/R/site-library'
   (as 'lib' is unspecified)
   Installing package into '/usr/local/lib/R/site-library'
   (as 'lib' is unspecified)
   Warning message:
   "package 'VCD' is not available for this version of {\tt R}
   A version of this package for your version of R might be available elsewhere,
   see the ideas at
   https://cran.r-project.org/doc/manuals/r-patched/R-admin.html#Installing-packages"
   Warning message:
   "Perhaps you meant 'vcd' ?"
   Installing package into '/usr/local/lib/R/site-library'
   (as 'lib' is unspecified)
1 library(ISLR)
2 library(tidyverse)
3 library(mosaic)
   Registered S3 method overwritten by 'mosaic':
     fortify.SpatialPolygonsDataFrame ggplot2
   The 'mosaic' package masks several functions from core packages in order to add
   additional features. The original behavior of these functions should not be affected by this.
   Attaching package: 'mosaic'
   The following object is masked from 'package:Matrix':
       mean
   The following objects are masked from 'package:dplyr':
       count, do, tally
   The following object is masked from 'package:purrr':
       cross
   The following object is masked from 'package:ggplot2':
       stat
   The following objects are masked from 'package:stats':
       binom.test, cor, cor.test, cov, fivenum, IQR, median, prop.test,
       quantile, sd, t.test, var
   The following objects are masked from 'package:base':
       max, mean, min, prod, range, sample, sum
```

- 1 # Analisis de datos
- 2 head(Weekly)
- 3 glimpse(Weekly)
- 4 summary(Weekly)
  5 pairs(Weekly)
- 6 cor(Weekly[, -9])
- 7 attach(Weekly)
- 8 plot(Volume)

```
<apt>
                                                       <qpT>
                                                                 <qpT>
      <db1>
            <qpt> <qpt> <qpt> <qpt> <qpt> <qpt>
       1990
             0.816
                    1.572 -3.936
                                -0.229 -3.484 0.1549760
                                                       -0.270
    1
    2
       1990
             -0.270
                    0.816
                           1.572
                                -3.936
                                       -0.229 0.1485740
                                                       -2.576
                                                                      0
   3
       1990
             -2.576
                   -0.270
                           0.816
                                 1.572
                                       -3.936 0.1598375
                                                        3.514
    4
       1990
             3.514
                    -2.576
                          -0.270
                                 0.816
                                        1.572 0.1616300
                                                        0.712
       1990
             0.712
                    3.514
                          -2.576
                                -0.270
                                       0.816 0.1537280
   6
       1990
             1.178
                    0.712
                          3.514 -2.576 -0.270 0.1544440 -1.372
                                                                     0
   Rows: 1.089
   Columns: 9
   $ Year
               <dbl> 1990, 1990, 1990, 1990, 1990, 1990, 1990, 1990, 1990, 1990, ...
               <dbl> 0.816, -0.270, -2.576, 3.514, 0.712, 1.178, -1.372, 0.807, 0...
   $ Lag1
   $ Lag2
               <dbl> 1.572, 0.816, -0.270, -2.576, 3.514, 0.712, 1.178, -1.372, 0...
   $ Lag3
               <dbl> -3.936, 1.572, 0.816, -0.270, -2.576, 3.514, 0.712, 1.178, -...
               <dbl> -0.229, -3.936, 1.572, 0.816, -0.270, -2.576, 3.514, 0.712, ...
   $ Lag4
               <dbl> -3.484, -0.229, -3.936, 1.572, 0.816, -0.270, -2.576, 3.514,...
   $ Lag5
   $ Volume
               <dbl> 0.1549760, 0.1485740, 0.1598375, 0.1616300, 0.1537280, 0.154...
               <dbl> -0.270, -2.576, 3.514, 0.712, 1.178, -1.372, 0.807, 0.041, 1...
   Year
                       Lag1
                                          Lag2
                                                            Lag3
         :1990
                  Min. :-18.1950
                                     Min. :-18.1950
                                                        Min. :-18.1950
                  1st Qu.: -1.1540
    1st Ou.:1995
                                     1st Qu.: -1.1540
                                                        1st Ou.: -1.1580
    Median :2000
                  Median : 0.2410
                                     Median : 0.2410
                                                        Median : 0.2410
    Mean :2000
                  Mean : 0.1506
                                     Mean : 0.1511
                                                        Mean : 0.1472
    3rd Qu.:2005
                   3rd Qu.: 1.4050
                                     3rd Qu.: 1.4090
                                                        3rd Qu.: 1.4090
    Max. :2010
                  Max.
                        : 12.0260
                                     Max. : 12.0260
                                                        Max.
                                                              : 12.0260
                                             Volume
        Lag4
                           Lag5
    Min.
          :-18.1950
                      Min.
                            :-18.1950
                                         Min.
                                               :0.08747
                                                           Min.
                                                                 :-18.1950
    1st Ou.: -1.1580
                      1st Ou.: -1.1660
                                         1st Ou.:0.33202
                                                           1st Qu.: -1.1540
    Median : 0.2380
                      Median : 0.2340
                                         Median :1.00268
                                                           Median : 0.2410
          : 0.1458
                                0.1399
                                         Mean :1.57462
                                                           Mean :
    3rd Qu.: 1.4090
                      3rd Qu.: 1.4050
                                         3rd Ou.:2.05373
                                                           3rd Ou.: 1.4050
    Max. : 12.0260
                      Max. : 12.0260
                                         Max. :9.32821
                                                           Max.
                                                                 : 12.0260
     Direction
    Min. :0.0000
    1st Ou.:0.0000
    Median :1.0000
    Mean :0.5556
    3rd Qu.:1.0000
    Max. :1.0000
                                          A matrix: 8 × 8 of type dbl
                Year
                            Lag1
                                       Lag2
                                                  Lag3
                                                             Lag4
                                                                         Lag5
                                                                                  Volume
                                                                                               Today
2 modelo.log.m <- glm(Direction ~ . -Today, data = Weekly, family = binomial)</pre>
```

```
1 # Calculo de modelo logistico
```

6

<sup>3</sup> summary(modelo.log.m)

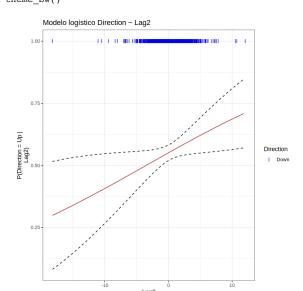
<sup>4</sup> contrasts(Direction)

<sup>5</sup> confint(object = modelo.log.m, level = 0.95)

```
Call:
   glm(formula = Direction ~ . - Today, family = binomial, data = Weekly)
1 # Modelo logistico con variables significativas
2 ggplot(data = Weekly, mapping = aes(x = Direction, y = Lag2)) +
3 geom_boxplot(aes(color = Direction)) +
4 geom_point(aes(color = Direction)) +
5 \text{ theme bw()} +
6 theme(legend.position = "null")
               -0.014022 0.020403 -0.331 080.3303
1 # Training: observaciones desde 1990 hasta 2008
2 datos.entrenamiento <- (Year < 2009)
                                           60 80 Ago
1 # Test: observaciones de 2009 y 2010
2 datos.test <- Weekly[!datos.entrenamiento, ]</pre>
   Restagat acviance. 1100.2 on 1001
1 # Verifica:
2 nrow(datos.entrenamiento) + nrow(datos.test)
          0
                200
                       400
                               600
                                      800
                                             1000
1 # Ajuste del modelo logístico con variables significativas
2 modelo.log.s <- glm(Direction ~ Lag2, data = Weekly, family = binomial, subset = datos.entrenamiento)
3 summary(modelo.log.s)
   Call:
   glm(formula = Direction ~ Lag2, family = binomial, data = Weekly,
       subset = datos.entrenamiento)
   Coefficients:
               Estimate Std. Error z value Pr(>|z|)
                           0.06428 3.162 0.00157 **
0.02870 2.024 0.04298 *
   (Intercept) 0.20326
   Lag2
                0.05810
   Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
   (Dispersion parameter for binomial family taken to be 1)
       Null deviance: 1354.7 on 984 degrees of freedom
   Residual deviance: 1350.5 on 983 degrees of freedom
   AIC: 1354.5
   Number of Fisher Scoring iterations: 4
1 # Vector con nuevos valores interpolados en el rango del predictor Lag2:
2 nuevos_puntos <- seq(from = min(Weekly$Lag2), to = max(Weekly$Lag2), by = 0.5)
1 # Predicción de los nuevos puntos según el modelo con el comando predict() se calcula la probabilidad de que la variable respue
2 predicciones <- predict(modelo.log.s, newdata = data.frame(Lag2 = nuevos_puntos), se.fit = TRUE, type = "response")
1 # Límites del intervalo de confianza (95%) de las predicciones
2 CI inferior <- predicciones$fit - 1.96 * predicciones$se.fit
3 CI_superior <- predicciones$fit + 1.96 * predicciones$se.fit</pre>
1 # Matriz de datos con los nuevos puntos y sus predicciones
2 datos_curva <- data.frame(Lag2 = nuevos_puntos, probabilidad = predicciones$fit, CI.inferior = CI_inferior, CI.superior = CI_su
1 # Codificación 0,1 de la variable respuesta Direction
2 Weekly$Direction <- ifelse(Weekly$Direction == "Down", yes = 0, no = 1)</pre>
1 ggplot(Weekly, aes(x = Lag2, y = Direction)) +
2 geom point(aes(color = as.factor(Direction)), shape = "I", size = 3) +
3 geom_line(data = datos_curva, aes(y = probabilidad), color = "firebrick") +
4 geom_line(data = datos_curva, aes(y = CI.superior), linetype = "dashed") +
5 geom line(data = datos curva, aes(y = CI.inferior), linetype = "dashed") +
6 labs(title = "Modelo logístico Direction ~ Lag2", y = "P(Direction = Up |
7 \text{ Lag2})", x = "\text{Lag2}") +
8 scale_color_manual(labels = c("Down", "Up"), values = c("blue", "red")) +
```

1

```
9 guides(color=guide_legend("Direction")) +
10 theme(plot.title = element_text(hjust = 0.5)) +
11 theme_bw()
```



1 # Chi cuadrada: Se evalúa la significancia del modelo con predictores con respecto al modelo nulo ("Residual deviance" vs "Null 2 anova(modelo.log.s, test ='Chisq')

A anova: 2 x 5

Df Deviance Resid. Df Resid. Dev Pr(>Chi)

	<int></int>	<dbl></dbl>	<int></int>	<dbl></dbl>	<dbl></dbl>
NULL	NA	NA	984	1354.710	NA
Lag2	1	4 166594	983	1350 543	0.04122861

```
1 # Cálculo de la probabilidad predicha por el modelo con los datos de test
2 prob.modelo <- predict(modelo.log.s, newdata = datos.test, type = "response")

1 # Vector de elementos "Down"
2 pred.modelo <- rep("Down", length(prob.modelo))
3 # Sustitución de "Down" por "Up" si la p > 0.5
4 pred.modelo[prob.modelo > 0.5] <- "Up"
5
6 Direction.0910 = Direction[!datos.entrenamiento]

1 # Matriz de confusión
2 matriz.confusion <- table(pred.modelo, Direction.0910)
3 matriz.confusion

Direction.0910
pred.modelo 0 1
Down 9 5
Up 34 56</pre>
```