

# Gamlss Regular

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```
#Quanto menor o AIC melhor.
```

```
source("dados_regular.R")
```

```
## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
## v dplyr      1.1.4      v readr      2.1.5
## v forcats    1.0.0      v stringr   1.5.1
## v lubridate  1.9.3      v tibble    3.2.1
## v purrr      1.0.2      v tidyr     1.3.1
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()     masks stats::lag()
## i Use the conflicted package (<http://conflicted.r-lib.org/>) to force all conflicts to become errors
## Loading required package: splines
##
## Loading required package: gamlss.data
##
##
## Attaching package: 'gamlss.data'
##
##
## The following object is masked from 'package:datasets':
##
##     sleep
##
## Loading required package: gamlss.dist
##
## Loading required package: nlme
##
##
## Attaching package: 'nlme'
##
##
## The following object is masked from 'package:dplyr':
##
##     collapse
##
## Loading required package: parallel
##
## ***** GAMLSS Version 5.4-22 *****
##
```

```

## For more on GAMLSS look at https://www.gamlss.com/
##
## Type gamlssNews() to see new features/changes/bug fixes.
##
##
## Loading required package: carData
##
##
## Attaching package: 'car'
##
##
## The following object is masked from 'package:dplyr':
##
##     recode
##
## The following object is masked from 'package:purrr':
##
##     some
##
## Loading required package: zoo
##
##
## Attaching package: 'zoo'
##
##
## The following objects are masked from 'package:base':
##
##     as.Date, as.Date.numeric

#Pacote que será utilizado para o gamlss
#install.packages("gamlss")
library(gamlss)

### Aplicação da modelagem

##### Beta #####
gamlss.family(BE)

##
## GAMLSS Family: BE Beta
## Link function for mu    : logit
## Link function for sigma: logit

#### Modelo Completo família beta ####
modelo_gamlss <- gamlss(WINP ~ ., data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1351.587
## GAMLSS-RS iteration 2: Global Deviance = -1750.471
## GAMLSS-RS iteration 3: Global Deviance = -1751.076
## GAMLSS-RS iteration 4: Global Deviance = -1751.076

modelo_gamlss

##

```

```

## Family:  c("BE", "Beta")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ ., family = BE, data = dados_regressao)
##
## Mu Coefficients:
##              (Intercept)              TEAMBoston Celtics
##              -1.745e+00              -5.872e-02
##              TEAMBrooklyn Nets              TEAMCharlotte Bobcats
##              2.832e-02              3.030e-02
##              TEAMCharlotte Hornets              TEAMChicago Bulls
##              -3.680e-02              4.665e-02
##              TEAMCleveland Cavaliers              TEAMDallas Mavericks
##              2.738e-02              -7.466e-02
##              TEAMDenver Nuggets              TEAMDetroit Pistons
##              7.957e-04              -1.206e-01
##              TEAMGolden State Warriors              TEAMHouston Rockets
##              -6.539e-02              5.090e-02
##              TEAMIndiana Pacers              TEAMLA Clippers
##              -1.953e-02              -3.467e-02
##              TEAMLos Angeles Clippers              TEAMLos Angeles Lakers
##              -7.768e-02              3.365e-02
##              TEAMMemphis Grizzlies              TEAMMiami Heat
##              5.077e-02              -1.300e-02
##              TEAMMilwaukee Bucks              TEAMMinnesota Timberwolves
##              -6.946e-02              -1.912e-01
##              TEAMNew Jersey Nets              TEAMNew Orleans Hornets
##              -1.403e-01              -8.191e-02
##              TEAMNew Orleans Pelicans              TEAMNew York Knicks
##              -1.439e-01              -9.262e-02
##              TEAMOklahoma City Thunder              TEAMOrlando Magic
##              8.419e-03              -6.816e-02
##              TEAMPhiladelphia 76ers              TEAMPhoenix Suns
##              -9.044e-02              -2.098e-02
##              TEAMPortland Trail Blazers              TEAMSacramento Kings
##              4.528e-02              -4.641e-02
##              TEAMSan Antonio Spurs              TEAMToronto Raptors
##              -5.241e-02              -5.236e-02
##              TEAMUtah Jazz              TEAMWashington Wizards
##              -1.252e-01              -6.334e-02
##              PTS              FGM
##              -1.295e-01              1.809e-01
##              FGA              FGP
##              1.261e-02              9.625e-02
##              `3PM`              `3PA`
##              7.866e-02              2.018e-02
##              `3PP`              FTM
##              2.312e-02              2.918e-01
##              FTA              FTP
##              -1.361e-01              -3.677e-02
##              OREB              DREB
##              2.404e-01              2.396e-01
##              REB              AST
##              -2.071e-01              8.921e-03

```

```

##          TOV          STL
##      -4.091e-02      4.407e-02
##          BLK          BLKA
##      -3.007e-05      -2.126e-02
##          PF          PFD
##      -6.279e-03      2.031e-02
##      PlusMinus      Numero_temporada2
##      1.127e-01      2.159e-02
##      Numero_temporada3      Numero_temporada4
##      2.208e-02      4.392e-02
##      Numero_temporada5      Numero_temporada6
##      7.634e-03      -6.390e-03
##      Numero_temporada7      Numero_temporada8
##      1.586e-02      7.494e-03
##      Numero_temporada9      Numero_temporada10
##      -3.938e-03      -2.007e-02
##      Numero_temporada11      Numero_temporada12
##      -1.917e-02      -9.704e-03
##      Numero_temporada13      Numero_temporada14
##      -4.290e-02      -4.930e-02
##      Numero_temporada15
##      -1.769e-02
## Sigma Coefficients:
## (Intercept)
##      -2.547
##
## Degrees of Freedom for the fit: 70 Residual Deg. of Freedom    380
## Global Deviance:      -1751.08
##      AIC:      -1611.08
##      SBC:      -1323.43

```

```
coef(modelo_gamlss)
```

```

##          (Intercept)      TEAMBoston Celtics
##      -1.745346e+00      -5.872290e-02
##      TEAMBrooklyn Nets      TEAMCharlotte Bobcats
##      2.832024e-02      3.030115e-02
##      TEAMCharlotte Hornets      TEAMChicago Bulls
##      -3.679996e-02      4.665292e-02
##      TEAMCleveland Cavaliers      TEAMDallas Mavericks
##      2.738172e-02      -7.465550e-02
##      TEAMDenver Nuggets      TEAMDetroit Pistons
##      7.956701e-04      -1.205830e-01
##      TEAMGolden State Warriors      TEAMHouston Rockets
##      -6.539400e-02      5.090127e-02
##      TEAMIndiana Pacers      TEAMLA Clippers
##      -1.953105e-02      -3.467489e-02
##      TEAMLos Angeles Clippers      TEAMLos Angeles Lakers
##      -7.768011e-02      3.365045e-02
##      TEAMMemphis Grizzlies      TEAMMiami Heat
##      5.077486e-02      -1.300403e-02
##      TEAMMilwaukee Bucks      TEAMMinnesota Timberwolves
##      -6.945829e-02      -1.912275e-01
##      TEAMNew Jersey Nets      TEAMNew Orleans Hornets
##      -1.402962e-01      -8.191034e-02

```

## TEAMNew Orleans Pelicans	TEAMNew York Knicks
## -1.439485e-01	-9.261671e-02
## TEAMOklahoma City Thunder	TEAMOrlando Magic
## 8.418506e-03	-6.816116e-02
## TEAMPhiladelphia 76ers	TEAMPhoenix Suns
## -9.044110e-02	-2.098121e-02
## TEAMPortland Trail Blazers	TEAMSacramento Kings
## 4.527856e-02	-4.641321e-02
## TEAMSan Antonio Spurs	TEAMToronto Raptors
## -5.240623e-02	-5.235558e-02
## TEAMUtah Jazz	TEAMWashington Wizards
## -1.251667e-01	-6.334127e-02
## PTS	FGM
## -1.294621e-01	1.809039e-01
## FGA	FGP
## 1.261381e-02	9.624725e-02
## `3PM`	`3PA`
## 7.866082e-02	2.018384e-02
## `3PP`	FTM
## 2.312406e-02	2.917692e-01
## FTA	FTP
## -1.360674e-01	-3.676968e-02
## OREB	DREB
## 2.404499e-01	2.396342e-01
## REB	AST
## -2.071492e-01	8.921452e-03
## TOV	STL
## -4.090893e-02	4.407011e-02
## BLK	BLKA
## -3.007068e-05	-2.126365e-02
## PF	PFD
## -6.279338e-03	2.030577e-02
## PlusMinus	Numero_temporada2
## 1.127013e-01	2.159097e-02
## Numero_temporada3	Numero_temporada4
## 2.208408e-02	4.392360e-02
## Numero_temporada5	Numero_temporada6
## 7.634087e-03	-6.389642e-03
## Numero_temporada7	Numero_temporada8
## 1.585872e-02	7.494271e-03
## Numero_temporada9	Numero_temporada10
## -3.937855e-03	-2.006763e-02
## Numero_temporada11	Numero_temporada12
## -1.917171e-02	-9.703819e-03
## Numero_temporada13	Numero_temporada14
## -4.289863e-02	-4.929810e-02
## Numero_temporada15	
## -1.768696e-02	

```
summary(modelo_gamlss) #AIC: -1617.542
```

```
## *****
## Family: c("BE", "Beta")
##
## Call: gamlss(formula = WINP ~ ., family = BE, data = dados_regressao)
```

```

##
## Fitting method: RS()
##
## -----
## Mu link function:  logit
## Mu Coefficients:
##
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   -1.745e+00  5.677e+00  -0.307  0.75866
## TEAMBoston Celtics   -5.872e-02  5.815e-02  -1.010  0.31323
## TEAMBrooklyn Nets     2.832e-02  6.128e-02   0.462  0.64426
## TEAMCharlotte Bobcats   3.030e-02  8.246e-02   0.367  0.71347
## TEAMCharlotte Hornets  -3.680e-02  6.710e-02  -0.548  0.58374
## TEAMChicago Bulls     4.665e-02  5.821e-02   0.801  0.42337
## TEAMCleveland Cavaliers  2.738e-02  5.879e-02   0.466  0.64163
## TEAMDallas Mavericks  -7.466e-02  5.941e-02  -1.257  0.20970
## TEAMDenver Nuggets     7.957e-04  5.807e-02   0.014  0.98907
## TEAMDetroit Pistons   -1.206e-01  6.053e-02  -1.992  0.04706 *
## TEAMGolden State Warriors -6.539e-02  6.196e-02  -1.055  0.29193
## TEAMHouston Rockets    5.090e-02  6.049e-02   0.841  0.40063
## TEAMIndiana Pacers    -1.953e-02  5.735e-02  -0.341  0.73362
## TEAMLA Clippers      -3.467e-02  7.106e-02  -0.488  0.62588
## TEAMLos Angeles Clippers -7.768e-02  7.707e-02  -1.008  0.31414
## TEAMLos Angeles Lakers   3.365e-02  5.850e-02   0.575  0.56548
## TEAMMemphis Grizzlies   5.077e-02  5.916e-02   0.858  0.39129
## TEAMMiami Heat        -1.300e-02  5.868e-02  -0.222  0.82473
## TEAMMilwaukee Bucks    -6.946e-02  5.705e-02  -1.217  0.22418
## TEAMMinnesota Timberwolves -1.912e-01  5.832e-02  -3.279  0.00114 **
## TEAMNew Jersey Nets    -1.403e-01  9.411e-02  -1.491  0.13684
## TEAMNew Orleans Hornets  -8.191e-02  8.058e-02  -1.016  0.31005
## TEAMNew Orleans Pelicans -1.439e-01  6.307e-02  -2.282  0.02303 *
## TEAMNew York Knicks    -9.262e-02  5.931e-02  -1.562  0.11922
## TEAMOklahoma City Thunder  8.419e-03  6.344e-02   0.133  0.89451
## TEAMOrlando Magic      -6.816e-02  5.834e-02  -1.168  0.24344
## TEAMPhiladelphia 76ers  -9.044e-02  5.936e-02  -1.524  0.12842
## TEAMPhoenix Suns       -2.098e-02  6.008e-02  -0.349  0.72710
## TEAMPortland Trail Blazers 4.528e-02  5.957e-02   0.760  0.44764
## TEAMSacramento Kings   -4.641e-02  5.900e-02  -0.787  0.43195
## TEAMSan Antonio Spurs   -5.241e-02  5.882e-02  -0.891  0.37352
## TEAMToronto Raptors    -5.236e-02  5.840e-02  -0.896  0.37056
## TEAMUtah Jazz         -1.252e-01  5.862e-02  -2.135  0.03337 *
## TEAMWashington Wizards  -6.334e-02  5.849e-02  -1.083  0.27955
## PTS                   -1.295e-01  5.792e-02  -2.235  0.02599 *
## FGM                    1.809e-01  8.944e-02   2.023  0.04380 *
## FGA                    1.261e-02  6.421e-02   0.196  0.84438
## FGP                    9.625e-02  1.148e-01   0.839  0.40224
## `3PM`                 7.866e-02  8.875e-02   0.886  0.37599
## `3PA`                 2.018e-02  2.280e-02   0.885  0.37657
## `3PP`                 2.312e-02  1.580e-02   1.464  0.14412
## FTM                    2.918e-01  1.034e-01   2.821  0.00504 **
## FTA                   -1.361e-01  8.032e-02  -1.694  0.09105 .
## FTP                   -3.677e-02  2.430e-02  -1.513  0.13105
## OREB                  2.404e-01  1.515e-01   1.587  0.11332
## DREB                  2.396e-01  1.507e-01   1.590  0.11274
## REB                   -2.071e-01  1.498e-01  -1.383  0.16746

```

```

## AST                8.921e-03  6.811e-03   1.310  0.19106
## TOV                -4.091e-02  1.589e-02  -2.574  0.01042 *
## STL                4.407e-02  1.759e-02   2.506  0.01264 *
## BLK                -3.007e-05  1.235e-02  -0.002  0.99806
## BLKA               -2.126e-02  1.803e-02  -1.180  0.23890
## PF                 -6.279e-03  7.881e-03  -0.797  0.42607
## PFD                2.031e-02  1.567e-02   1.296  0.19582
## PlusMinus          1.127e-01  6.465e-03  17.431  < 2e-16 ***
## Numero_temporada2  2.159e-02  4.160e-02   0.519  0.60407
## Numero_temporada3  2.208e-02  4.118e-02   0.536  0.59204
## Numero_temporada4  4.392e-02  4.771e-02   0.921  0.35778
## Numero_temporada5  7.634e-03  4.526e-02   0.169  0.86616
## Numero_temporada6 -6.390e-03  4.344e-02  -0.147  0.88313
## Numero_temporada7  1.586e-02  4.788e-02   0.331  0.74067
## Numero_temporada8  7.494e-03  5.145e-02   0.146  0.88427
## Numero_temporada9 -3.938e-03  5.556e-02  -0.071  0.94354
## Numero_temporada10 -2.007e-02  6.232e-02  -0.322  0.74761
## Numero_temporada11 -1.917e-02  7.315e-02  -0.262  0.79340
## Numero_temporada12 -9.704e-03  7.449e-02  -0.130  0.89642
## Numero_temporada13 -4.290e-02  7.922e-02  -0.542  0.58847
## Numero_temporada14 -4.930e-02  7.962e-02  -0.619  0.53618
## Numero_temporada15 -1.769e-02  7.511e-02  -0.235  0.81395
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function:  logit
## Sigma Coefficients:
##           Estimate Std. Error t value Pr(>|t|)
## (Intercept) -2.54704    0.03973  -64.11  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit:  450
## Degrees of Freedom for the fit:  70
##      Residual Deg. of Freedom:  380
##              at cycle:  4
##
## Global Deviance:    -1751.076
##           AIC:      -1611.076
##           SBC:      -1323.428
## *****

### Modelo com variáveis significantes em 10% ###
modelo_gamlss1 <- gamlss(WINP ~ `3PP` + FTM + STL + PlusMinus, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1316.911
## GAMLSS-RS iteration 2: Global Deviance = -1664.036
## GAMLSS-RS iteration 3: Global Deviance = -1664.526
## GAMLSS-RS iteration 4: Global Deviance = -1664.526
modelo_gamlss1

##

```

```
## Family: c("BE", "Beta")
## Fitting method: RS()
##
## Call: gamlss(formula = WINP ~ `3PP` + FTM + STL + PlusMinus,
## family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)      `3PP`      FTM      STL      PlusMinus
## -0.2405400    0.0081551   -0.0029726   -0.0004249    0.1341058
## Sigma Coefficients:
## (Intercept)
##      -2.444
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
## Global Deviance:      -1664.53
## AIC:      -1652.53
## SBC:      -1627.87
```

```
coef(modelo_gamlss1)
```

```
## (Intercept)      `3PP`      FTM      STL      PlusMinus
## -0.2405399799  0.0081550523 -0.0029726296 -0.0004248911  0.1341058097
```

```
summary(modelo_gamlss1) #Só Plus Minus foi significativo.
```

```
## *****
## Family: c("BE", "Beta")
##
## Call: gamlss(formula = WINP ~ `3PP` + FTM + STL + PlusMinus,
## family = BE, data = dados_regressao)
##
## Fitting method: RS()
##
## -----
## Mu link function: logit
## Mu Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) -0.2405400  0.2430720  -0.990   0.323
## `3PP`        0.0081551  0.0053672   1.519   0.129
## FTM         -0.0029726  0.0045266  -0.657   0.512
## STL         -0.0004249  0.0098042  -0.043   0.965
## PlusMinus    0.1341058  0.0022462  59.705 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function: logit
## Sigma Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) -2.44368    0.03589  -68.09 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit: 450
```



```

## Degrees of Freedom for the fit: 6
##      Residual Deg. of Freedom: 444
##              at cycle: 4
##
## Global Deviance:      -1664.526
##           AIC:        -1652.526
##           SBC:        -1627.87
## *****

#AIC:      -1652.526

##### Forward Selection beta #####
gamlss_completo = gamlss(WINP ~ ., data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1351.587
## GAMLSS-RS iteration 2: Global Deviance = -1750.471
## GAMLSS-RS iteration 3: Global Deviance = -1751.076
## GAMLSS-RS iteration 4: Global Deviance = -1751.076

gamlss_vazio = gamlss(WINP ~ 1, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -440.3197
## GAMLSS-RS iteration 2: Global Deviance = -440.3212
## GAMLSS-RS iteration 3: Global Deviance = -440.3212

step(gamlss_vazio, scope=list(upper=gamlss_completo, lower=gamlss_vazio), direction='forward', trace=TRUE)

## Start:  AIC=-436.32
## WINP ~ 1
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
## trying - Numero_temporada
##
##      Df      AIC      LRT    Pr(Chi)
## + PlusMinus      1 -1655.35 1221.03 < 2.2e-16 ***
## + FGP            1  -642.17  207.85 < 2.2e-16 ***

```

```

## + `3PP`          1 -592.98 158.65 < 2.2e-16 ***
## + BLKA            1 -546.72 112.40 < 2.2e-16 ***
## + DREB            1 -487.65  53.33 2.827e-13 ***
## + PTS             1 -480.48  46.16 1.088e-11 ***
## + TEAM            33 -478.01 107.69 7.514e-10 ***
## + FGM             1 -473.63  39.31 3.609e-10 ***
## + TOV             1 -472.43  38.11 6.692e-10 ***
## + AST             1 -470.25  35.93 2.046e-09 ***
## + REB             1 -466.10  31.78 1.726e-08 ***
## + BLK             1 -464.41  30.09 4.128e-08 ***
## + PF              1 -453.78  19.46 1.027e-05 ***
## + `3PM`           1 -452.66  18.34 1.850e-05 ***
## + FTP             1 -448.34  14.02 0.0001809 ***
## + FTM             1 -447.01  12.68 0.0003688 ***
## + STL             1 -446.53  12.21 0.0004747 ***
## + OREB            1 -442.70   8.38 0.0037993 **
## + PFD             1 -440.73   6.41 0.0113445 *
## + `3PA`           1 -440.40   6.08 0.0136559 *
## + FTA             1 -439.26   4.94 0.0261927 *
## + FGA             1 -437.65   3.33 0.0681982 .
## <none>            -436.32
## + Numero_temporada 14 -408.37   0.05 1.0000000
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1315.679
## GAMLSS-RS iteration 2: Global Deviance = -1660.864
## GAMLSS-RS iteration 3: Global Deviance = -1661.349
## GAMLSS-RS iteration 4: Global Deviance = -1661.349
##
## Step:  AIC=-1655.35
## WINP ~ PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - Numero_temporada

```

```

##              Df      AIC      LRT Pr(Chi)
## + FGP          1 -1658.9  5.554 0.01844 *
## + OREB          1 -1658.5  5.157 0.02315 *
## + PF            1 -1658.3  4.913 0.02665 *
## + `3PP`         1 -1656.1  2.746 0.09752 .
## + FGA           1 -1655.8  2.505 0.11350
## + BLKA          1 -1655.8  2.419 0.11988
## + REB           1 -1655.6  2.217 0.13649
## <none>          -1655.3
## + `3PA`         1 -1654.5  1.178 0.27769
## + FTA           1 -1654.2  0.853 0.35562
## + `3PM`         1 -1654.2  0.822 0.36472
## + FTM           1 -1654.1  0.746 0.38769
## + PFD           1 -1654.0  0.686 0.40763
## + PTS           1 -1653.8  0.490 0.48380
## + TOV           1 -1653.8  0.443 0.50580
## + AST           1 -1653.5  0.206 0.64987
## + BLK           1 -1653.5  0.128 0.72096
## + STL           1 -1653.5  0.111 0.73861
## + FGM           1 -1653.4  0.016 0.89842
## + DREB          1 -1653.4  0.013 0.90832
## + FTP           1 -1653.3  0.001 0.96956
## + TEAM          33 -1642.3 52.909 0.01540 *
## + Numero_temporada 14 -1627.9  0.580 1.00000
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1317.833
## GAMLSS-RS iteration 2: Global Deviance = -1666.409
## GAMLSS-RS iteration 3: Global Deviance = -1666.902
## GAMLSS-RS iteration 4: Global Deviance = -1666.902
##
## Step:  AIC=-1658.9
## WINP ~ PlusMinus + FGP
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD

```

```

## trying - Numero_temporada
##           Df      AIC      LRT Pr(Chi)
## + PTS           1 -1662.2  5.314 0.02115 *
## + PF            1 -1662.0  5.077 0.02425 *
## + FGM           1 -1661.3  4.417 0.03558 *
## + FGA           1 -1661.2  4.243 0.03941 *
## + `3PA`         1 -1659.2  2.322 0.12757
## + OREB          1 -1659.1  2.163 0.14134
## + `3PM`         1 -1659.0  2.131 0.14434
## <none>          -1658.9
## + REB           1 -1658.3  1.450 0.22855
## + BLKA          1 -1658.1  1.215 0.27033
## + FTM           1 -1658.0  1.099 0.29458
## + AST           1 -1657.8  0.942 0.33188
## + FTA           1 -1657.8  0.935 0.33368
## + TOV           1 -1657.8  0.873 0.35001
## + `3PP`         1 -1657.7  0.829 0.36256
## + PFD           1 -1657.5  0.591 0.44191
## + DREB          1 -1657.0  0.140 0.70823
## + BLK           1 -1657.0  0.124 0.72513
## + FTP           1 -1657.0  0.115 0.73485
## + STL           1 -1657.0  0.112 0.73825
## + TEAM          33 -1645.4 52.459 0.01704 *
## + Numero_temporada 14 -1634.8  3.885 0.99612
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1319.722
## GAMLSS-RS iteration 2: Global Deviance = -1671.714
## GAMLSS-RS iteration 3: Global Deviance = -1672.217
## GAMLSS-RS iteration 4: Global Deviance = -1672.217
##
## Step:  AIC=-1662.22
## WINP ~ PlusMinus + FGP + PTS
##
## trying - TEAM
## trying - FGM
## trying - FGA
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - Numero_temporada

```

```

##              Df      AIC      LRT Pr(Chi)
## + PF          1 -1664.8  4.626 0.03149 *
## + DREB         1 -1663.0  2.797 0.09446 .
## + OREB         1 -1662.6  2.397 0.12160
## <none>         -1662.2
## + TOV          1 -1661.5  1.318 0.25092
## + `3PM`        1 -1661.3  1.066 0.30180
## + `3PA`        1 -1661.3  1.053 0.30489
## + `3PP`        1 -1661.2  1.032 0.30964
## + BLKA         1 -1661.0  0.799 0.37143
## + FTA          1 -1660.9  0.695 0.40455
## + FTM          1 -1660.7  0.516 0.47270
## + PFD          1 -1660.5  0.311 0.57685
## + BLK          1 -1660.4  0.211 0.64593
## + AST          1 -1660.4  0.182 0.67002
## + REB          1 -1660.4  0.171 0.67936
## + FTP          1 -1660.2  0.038 0.84551
## + STL          1 -1660.2  0.034 0.85324
## + FGM          1 -1660.2  0.006 0.94035
## + FGA          1 -1660.2  0.000 0.98268
## + TEAM         33 -1648.3 52.088 0.01852 *
## + Numero_temporada 14 -1638.5  4.259 0.99370
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1321.858
## GAMLSS-RS iteration 2: Global Deviance = -1676.336
## GAMLSS-RS iteration 3: Global Deviance = -1676.843
## GAMLSS-RS iteration 4: Global Deviance = -1676.843
##
## Step:  AIC=-1664.84
## WINP ~ PlusMinus + FGP + PTS + PF
##
## trying - TEAM
## trying - FGM
## trying - FGA
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PFD
## trying - Numero_temporada
##              Df      AIC      LRT Pr(Chi)
## <none>         -1664.8
## + OREB         1 -1664.3  1.427 0.23228

```

```

## + DREB          1 -1664.0  1.201 0.27316
## + `3PP`         1 -1664.0  1.197 0.27399
## + BLKA          1 -1663.3  0.439 0.50743
## + `3PM`         1 -1663.2  0.307 0.57924
## + `3PA`         1 -1663.1  0.259 0.61115
## + FGM           1 -1663.1  0.226 0.63466
## + TOV           1 -1663.1  0.220 0.63874
## + FGA           1 -1663.0  0.132 0.71595
## + STL           1 -1663.0  0.109 0.74185
## + PFD           1 -1662.9  0.091 0.76341
## + BLK           1 -1662.9  0.046 0.83095
## + FTP           1 -1662.9  0.022 0.88264
## + FTA           1 -1662.8  0.010 0.91911
## + REB           1 -1662.8  0.009 0.92423
## + AST           1 -1662.8  0.002 0.96746
## + FTM           1 -1662.8  0.000 0.98961
## + TEAM          33 -1648.1 49.262 0.03415 *
## + Numero_temporada 14 -1640.6  3.743 0.99682
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

##
## Family:  c("BE", "Beta")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PlusMinus + FGP + PTS + PF,
##               family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)    PlusMinus          FGP          PTS          PF
## -0.505065     0.131669     0.023267    -0.003065    -0.012155
## Sigma Coefficients:
## (Intercept)
## -2.458
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom  444
## Global Deviance:    -1676.84
## AIC:                -1664.84
## SBC:                -1640.19

# Call:  gamlss(formula = WINP ~ PlusMinus + FGP + PTS + PF,          family = BE, data = dados_regressao)
#
# Mu Coefficients:
# (Intercept)    PlusMinus          FGP          PTS          PF
# -0.505065     0.131669     0.023267    -0.003065    -0.012155
# Sigma Coefficients:
# (Intercept)
# -2.458
#
# Degrees of Freedom for the fit: 6 Residual Deg. of Freedom  444
# Global Deviance:    -1676.84
# AIC:                -1664.84
# SBC:                -1640.19

gamlss_beta_forw = gamlss(formula = WINP ~ PlusMinus + FGP + PTS + PF, family = BE, data = dados_regressao)

```

```

## GAMLSS-RS iteration 1: Global Deviance = -1321.858
## GAMLSS-RS iteration 2: Global Deviance = -1676.336
## GAMLSS-RS iteration 3: Global Deviance = -1676.843
## GAMLSS-RS iteration 4: Global Deviance = -1676.843

gamlss_beta_forw

##
## Family: c("BE", "Beta")
## Fitting method: RS()
##
## Call: gamlss(formula = WINP ~ PlusMinus + FGP + PTS + PF,
## family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept) PlusMinus FGP PTS PF
## -0.505065 0.131669 0.023267 -0.003065 -0.012155
## Sigma Coefficients:
## (Intercept)
## -2.458
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom 444
## Global Deviance: -1676.84
## AIC: -1664.84
## SBC: -1640.19

coef(gamlss_beta_forw)

## (Intercept) PlusMinus FGP PTS PF
## -0.505064513 0.131668749 0.023266609 -0.003064737 -0.012154978

summary(gamlss_beta_forw) #AIC: -1664.843

## *****
## Family: c("BE", "Beta")
##
## Call: gamlss(formula = WINP ~ PlusMinus + FGP + PTS + PF,
## family = BE, data = dados_regressao)
##
## Fitting method: RS()
##
## -----
## Mu link function: logit
## Mu Coefficients:
## Estimate Std. Error t value Pr(>|t|)
## (Intercept) -0.505065 0.305547 -1.653 0.09904 .
## PlusMinus 0.131669 0.002219 59.330 < 2e-16 ***
## FGP 0.023267 0.007249 3.210 0.00143 **
## PTS -0.003065 0.001395 -2.198 0.02849 *
## PF -0.012155 0.005639 -2.156 0.03165 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function: logit
## Sigma Coefficients:

```

```

##           Estimate Std. Error t value Pr(>|t|)
## (Intercept) -2.45847    0.03586  -68.56  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit:  450
## Degrees of Freedom for the fit:  6
##      Residual Deg. of Freedom: 444
##                      at cycle:  4
##
## Global Deviance:      -1676.843
##           AIC:        -1664.843
##           SBC:        -1640.188
## *****
##### backward regression beta #####
#Seleção das variáveis para compor o modelo, mas precisa depois fazer os teste de resíduo
gamlss_completo = gamlss(WINP ~ ., data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1351.587
## GAMLSS-RS iteration 2: Global Deviance = -1750.471
## GAMLSS-RS iteration 3: Global Deviance = -1751.076
## GAMLSS-RS iteration 4: Global Deviance = -1751.076

gamlss_vazio = gamlss(WINP ~ 1, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -440.3197
## GAMLSS-RS iteration 2: Global Deviance = -440.3212
## GAMLSS-RS iteration 3: Global Deviance = -440.3212

step(gamlss_completo, scope=list(upper=gamlss_completo, lower=gamlss_vazio), direction='backward', trace=

## Start:  AIC=-1611.08
## WINP ~ TEAM + PTS + FGM + FGA + FGP + `3PM` + `3PA` + `3PP` +
##      FTM + FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLK +
##      BLKA + PF + PFD + PlusMinus + Numero_temporada
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK

```



```

## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
## trying - Numero_temporada
##           Df      AIC      LRT    Pr(Chi)
## - Numero_temporada 14 -1636.3    2.816  0.999357
## - TEAM              33 -1617.5   59.534  0.003116 **
## - BLK                1 -1613.1    0.000  0.998062
## - FGA                1 -1613.0    0.043  0.836232
## - `3PM`              1 -1612.7    0.417  0.518449
## - PF                 1 -1612.4    0.634  0.425829
## - FGM                1 -1612.3    0.744  0.388537
## - FGP                1 -1612.3    0.772  0.379473
## - `3PA`              1 -1612.3    0.779  0.377337
## - BLKA               1 -1611.7    1.392  0.238133
## - PTS                1 -1611.5    1.527  0.216587
## - PFD                1 -1611.4    1.658  0.197933
## - AST                1 -1611.4    1.712  0.190786
## - REB                1 -1611.2    1.863  0.172301
## <none>              -1611.1
## - `3PP`              1 -1610.9    2.139  0.143575
## - FTP                1 -1610.8    2.300  0.129393
## - OREB               1 -1610.6    2.444  0.117992
## - DREB               1 -1610.6    2.459  0.116867
## - FTA                1 -1610.2    2.857  0.090991 .
## - FTM                1 -1608.2    4.860  0.027493 *
## - STL                1 -1606.8    6.256  0.012378 *
## - TOV                1 -1606.5    6.569  0.010375 *
## - PlusMinus          1 -1378.1  235.003 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1350.529
## GAMLSS-RS iteration 2: Global Deviance = -1747.66
## GAMLSS-RS iteration 3: Global Deviance = -1748.26
## GAMLSS-RS iteration 4: Global Deviance = -1748.26
##
## Step:  AIC=-1636.26
## WINP ~ TEAM + PTS + FGM + FGA + FGP + `3PM` + `3PA` + `3PP` +
##       FTM + FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLK +
##       BLKA + PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB

```

```

## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT    Pr(Chi)
## - TEAM      33 -1643.7   58.54  0.004005 **
## - BLK        1 -1638.3    0.00  0.951889
## - FGA        1 -1638.2    0.06  0.803893
## - `3PM`      1 -1637.9    0.38  0.538467
## - `3PA`      1 -1637.7    0.54  0.461652
## - FGP        1 -1637.7    0.61  0.435264
## - FGM        1 -1637.6    0.68  0.408962
## - PF         1 -1637.4    0.85  0.357889
## - PFD        1 -1637.0    1.21  0.270391
## - PTS        1 -1636.9    1.36  0.243675
## - AST        1 -1636.8    1.46  0.226673
## - REB        1 -1636.8    1.48  0.223554
## - BLKA       1 -1636.5    1.74  0.186629
## - `3PP`      1 -1636.5    1.78  0.181687
## - OREB       1 -1636.4    1.87  0.171684
## - DREB       1 -1636.3    1.93  0.165274
## <none>      -1636.3
## - FTP        1 -1635.4    2.90  0.088578 .
## - FTA        1 -1635.1    3.19  0.073911 .
## - FTM        1 -1633.2    5.10  0.023947 *
## - TOV        1 -1633.0    5.26  0.021806 *
## - STL        1 -1632.5    5.74  0.016547 *
## - PlusMinus  1 -1263.9  374.36 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1327.232
## GAMLSS-RS iteration 2: Global Deviance = -1689.197
## GAMLSS-RS iteration 3: Global Deviance = -1689.72
## GAMLSS-RS iteration 4: Global Deviance = -1689.72
##
## Step:  AIC=-1643.72
## WINP ~ PTS + FGM + FGA + FGP + `3PM` + `3PA` + `3PP` + FTM +
##       FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLK + BLKA +
##       PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM

```

```

## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - `3PM`      1 -1645.7    0.00 0.96878
## - BLK        1 -1645.7    0.01 0.93625
## - AST        1 -1645.7    0.02 0.87792
## - BLKA       1 -1645.7    0.06 0.81202
## - FGM        1 -1645.6    0.11 0.73486
## - FGA        1 -1645.4    0.29 0.58720
## - PTS        1 -1645.1    0.65 0.42129
## - FTP        1 -1644.9    0.84 0.36043
## - REB        1 -1644.8    0.87 0.35017
## - PFD        1 -1644.8    0.91 0.34075
## - FGP        1 -1644.7    1.03 0.31060
## - OREB       1 -1644.7    1.04 0.30693
## - FTA        1 -1644.6    1.09 0.29596
## - DREB       1 -1644.6    1.11 0.29150
## - `3PA`      1 -1644.0    1.69 0.19329
## - FTM        1 -1643.8    1.89 0.16933
## <none>      -1643.7
## - TOV        1 -1643.7    2.03 0.15465
## - STL        1 -1643.2    2.55 0.11028
## - PF         1 -1643.0    2.67 0.10247
## - `3PP`      1 -1642.9    2.82 0.09313 .
## - PlusMinus  1 -1226.6 419.09 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1327.231
## GAMLSS-RS iteration 2: Global Deviance = -1689.196
## GAMLSS-RS iteration 3: Global Deviance = -1689.719
## GAMLSS-RS iteration 4: Global Deviance = -1689.719
##
## Step:  AIC=-1645.72
## WINP ~ PTS + FGM + FGA + FGP + `3PA` + `3PP` + FTM + FTA + FTP +
##       OREB + DREB + REB + AST + TOV + STL + BLK + BLKA + PF + PFD +
##       PlusMinus
##
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`

```

```

## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - BLK      1 -1647.7    0.01 0.93542
## - AST      1 -1647.7    0.02 0.87868
## - BLKA     1 -1647.7    0.06 0.81228
## - FGM      1 -1647.5    0.16 0.68573
## - FGA      1 -1647.4    0.33 0.56290
## - FTP      1 -1646.9    0.85 0.35535
## - REB      1 -1646.8    0.87 0.35027
## - PFD      1 -1646.8    0.92 0.33804
## - OREB     1 -1646.7    1.04 0.30698
## - DREB     1 -1646.6    1.11 0.29147
## - FTA      1 -1646.6    1.12 0.29049
## - FGP      1 -1646.5    1.18 0.27682
## <none>     -1645.7
## - TOV      1 -1645.7    2.03 0.15440
## - `3PA`    1 -1645.4    2.33 0.12655
## - PTS      1 -1645.4    2.36 0.12463
## - STL      1 -1645.2    2.55 0.11031
## - PF       1 -1645.0    2.67 0.10256
## - FTM      1 -1644.8    2.89 0.08917 .
## - `3PP`    1 -1644.0    3.67 0.05542 .
## - PlusMinus 1 -1228.5 419.26 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1327.22
## GAMLSS-RS iteration 2: Global Deviance = -1689.189
## GAMLSS-RS iteration 3: Global Deviance = -1689.712
## GAMLSS-RS iteration 4: Global Deviance = -1689.712
##
## Step:  AIC=-1647.71
## WINP ~ PTS + FGM + FGA + FGP + `3PA` + `3PP` + FTM + FTA + FTP +
##       OREB + DREB + REB + AST + TOV + STL + BLKA + PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM

```

```

## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - AST      1 -1649.7    0.02 0.88099
## - BLKA      1 -1649.7    0.06 0.81373
## - FGM       1 -1649.5    0.16 0.68533
## - FGA       1 -1649.4    0.33 0.56364
## - FTP       1 -1648.9    0.85 0.35598
## - REB       1 -1648.8    0.88 0.34957
## - PFD       1 -1648.7    1.00 0.31688
## - OREB      1 -1648.7    1.05 0.30628
## - DREB      1 -1648.6    1.11 0.29111
## - FTA       1 -1648.6    1.12 0.29041
## - FGP       1 -1648.5    1.18 0.27702
## <none>      -1647.7
## - TOV       1 -1647.7    2.07 0.15068
## - `3PA`     1 -1647.4    2.34 0.12601
## - PTS       1 -1647.3    2.36 0.12461
## - STL       1 -1647.2    2.54 0.11077
## - PF        1 -1647.0    2.72 0.09880 .
## - FTM       1 -1646.8    2.89 0.08936 .
## - `3PP`     1 -1646.0    3.68 0.05505 .
## - PlusMinus 1 -1225.3 424.42 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1327.21
## GAMLSS-RS iteration 2: Global Deviance = -1689.167
## GAMLSS-RS iteration 3: Global Deviance = -1689.69
## GAMLSS-RS iteration 4: Global Deviance = -1689.69
##
## Step:  AIC=-1649.69
## WINP ~ PTS + FGM + FGA + FGP + `3PA` + `3PP` + FTM + FTA + FTP +
##       OREB + DREB + REB + TOV + STL + BLKA + PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB

```

```

## trying - DREB
## trying - REB
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - BLKA      1 -1651.6    0.05 0.82075
## - FGM       1 -1651.5    0.17 0.68133
## - FGA       1 -1651.4    0.33 0.56438
## - FTP       1 -1650.8    0.85 0.35597
## - REB       1 -1650.8    0.90 0.34237
## - PFD       1 -1650.6    1.05 0.30542
## - OREB      1 -1650.6    1.07 0.30109
## - FTA       1 -1650.6    1.12 0.28905
## - DREB      1 -1650.5    1.14 0.28521
## - FGP       1 -1650.5    1.18 0.27761
## <none>      -1649.7
## - TOV       1 -1649.6    2.09 0.14804
## - `3PA`     1 -1649.3    2.34 0.12569
## - PTS       1 -1649.3    2.36 0.12461
## - STL       1 -1649.1    2.55 0.11030
## - PF        1 -1648.8    2.87 0.09025 .
## - FTM       1 -1648.8    2.88 0.08942 .
## - `3PP`     1 -1648.0    3.67 0.05539 .
## - PlusMinus 1 -1222.4 429.33 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1327.205
## GAMLSS-RS iteration 2: Global Deviance = -1689.116
## GAMLSS-RS iteration 3: Global Deviance = -1689.638
## GAMLSS-RS iteration 4: Global Deviance = -1689.638
##
## Step:  AIC=-1651.64
## WINP ~ PTS + FGM + FGA + FGP + `3PA` + `3PP` + FTM + FTA + FTP +
##       OREB + DREB + REB + TOV + STL + PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - TOV
## trying - STL
## trying - PF

```

```

## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - FGM      1 -1653.5    0.16 0.68584
## - FGA      1 -1653.3    0.33 0.56633
## - FTP      1 -1652.8    0.89 0.34486
## - REB      1 -1652.7    0.93 0.33453
## - PFD      1 -1652.5    1.09 0.29729
## - OREB     1 -1652.5    1.10 0.29410
## - FTA      1 -1652.5    1.18 0.27835
## - DREB     1 -1652.5    1.18 0.27807
## - FGP      1 -1652.4    1.19 0.27436
## <none>      -1651.6
## - PTS      1 -1651.3    2.34 0.12619
## - `3PA`    1 -1651.3    2.34 0.12602
## - TOV      1 -1651.3    2.34 0.12584
## - STL      1 -1651.1    2.52 0.11227
## - PF       1 -1650.8    2.82 0.09295 .
## - FTM      1 -1650.7    2.93 0.08692 .
## - `3PP`    1 -1650.0    3.65 0.05620 .
## - PlusMinus 1 -1221.6 432.07 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1327.152
## GAMLSS-RS iteration 2: Global Deviance = -1688.953
## GAMLSS-RS iteration 3: Global Deviance = -1689.475
## GAMLSS-RS iteration 4: Global Deviance = -1689.475
##
## Step:  AIC=-1653.47
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + FTA + FTP + OREB +
##       DREB + REB + TOV + STL + PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - TOV
## trying - STL
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - REB      1 -1654.6    0.89 0.34493
## - FTP      1 -1654.5    0.98 0.32338
## - OREB     1 -1654.4    1.06 0.30357
## - DREB     1 -1654.3    1.13 0.28693
## - PFD      1 -1654.3    1.19 0.27467

```

```

## - FTA      1 -1654.2    1.28 0.25731
## - FGA      1 -1653.7    1.74 0.18718
## <none>      -1653.5
## - TOV      1 -1653.1    2.33 0.12693
## - STL      1 -1653.0    2.45 0.11718
## - FTM      1 -1652.7    2.77 0.09607 .
## - PF       1 -1652.7    2.81 0.09345 .
## - `3PA`    1 -1652.3    3.12 0.07726 .
## - PTS      1 -1652.3    3.13 0.07700 .
## - FGP      1 -1651.0    4.51 0.03368 *
## - `3PP`    1 -1650.8    4.63 0.03150 *
## - PlusMinus 1 -1223.4 432.07 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1326.821
## GAMLSS-RS iteration 2: Global Deviance = -1688.062
## GAMLSS-RS iteration 3: Global Deviance = -1688.583
## GAMLSS-RS iteration 4: Global Deviance = -1688.583
##
## Step:  AIC=-1654.58
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + FTA + FTP + OREB +
##       DREB + TOV + STL + PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - FTP      1 -1655.7    0.89 0.34664
## - OREB     1 -1655.6    0.96 0.32684
## - PFD      1 -1655.4    1.16 0.28107
## - FTA      1 -1655.4    1.19 0.27574
## - FGA      1 -1654.7    1.86 0.17309
## <none>      -1654.6
## - TOV      1 -1654.3    2.31 0.12817
## - STL      1 -1654.3    2.32 0.12797
## - PF       1 -1654.0    2.61 0.10604
## - FTM      1 -1653.9    2.68 0.10154
## - `3PA`    1 -1653.3    3.26 0.07095 .
## - PTS      1 -1653.3    3.29 0.06982 .
## - DREB     1 -1652.8    3.74 0.05317 .
## - FGP      1 -1651.9    4.70 0.03012 *
## - `3PP`    1 -1651.9    4.71 0.02999 *

```



```

## - PlusMinus 1 -1225.4 431.20 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1326.427
## GAMLSS-RS iteration 2: Global Deviance = -1687.177
## GAMLSS-RS iteration 3: Global Deviance = -1687.697
## GAMLSS-RS iteration 4: Global Deviance = -1687.697
##
## Step: AIC=-1655.7
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + FTA + OREB + DREB +
##      TOV + STL + PF + PFD + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - PFD      1 -1656.8    0.92 0.33853
## - OREB      1 -1656.8    0.92 0.33618
## - FTA       1 -1656.8    0.93 0.33586
## <none>      -1655.7
## - TOV      1 -1655.5    2.23 0.13529
## - FGA      1 -1655.4    2.34 0.12619
## - STL      1 -1655.4    2.34 0.12599
## - PF       1 -1655.2    2.55 0.11053
## - DREB      1 -1654.1    3.58 0.05833 .
## - `3PA`     1 -1653.9    3.80 0.05126 .
## - FTM       1 -1653.9    3.82 0.05068 .
## - PTS      1 -1653.8    3.90 0.04818 *
## - FGP       1 -1652.3    5.36 0.02059 *
## - `3PP`     1 -1652.2    5.52 0.01877 *
## - PlusMinus 1 -1227.0 430.73 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1325.981
## GAMLSS-RS iteration 2: Global Deviance = -1686.262
## GAMLSS-RS iteration 3: Global Deviance = -1686.781
## GAMLSS-RS iteration 4: Global Deviance = -1686.781
##
## Step: AIC=-1656.78
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + FTA + OREB + DREB +
##      TOV + STL + PF + PlusMinus
##
## trying - PTS

```

```

## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PF
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - FTA      1 -1658.5    0.27 0.60109
## - OREB      1 -1658.2    0.56 0.45415
## - TOV      1 -1657.0    1.79 0.18063
## - STL      1 -1656.9    1.88 0.16986
## <none>      -1656.8
## - PF      1 -1656.6    2.15 0.14287
## - FGA      1 -1656.2    2.56 0.10949
## - DREB      1 -1655.7    3.05 0.08053 .
## - FTM      1 -1655.0    3.74 0.05301 .
## - `3PA`    1 -1654.9    3.85 0.04973 *
## - PTS      1 -1654.8    4.02 0.04502 *
## - FGP      1 -1653.4    5.36 0.02063 *
## - `3PP`    1 -1653.4    5.38 0.02042 *
## - PlusMinus 1 -1201.2 457.60 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1325.887
## GAMLSS-RS iteration 2: Global Deviance = -1685.989
## GAMLSS-RS iteration 3: Global Deviance = -1686.508
## GAMLSS-RS iteration 4: Global Deviance = -1686.508
##
## Step:  AIC=-1658.51
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + OREB + DREB +
##       TOV + STL + PF + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PF
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - OREB      1 -1660.2    0.33 0.56505
## - STL      1 -1658.9    1.64 0.19998
## - TOV      1 -1658.8    1.71 0.19088

```

```

## <none>          -1658.5
## - PF            1 -1658.2    2.28 0.13111
## - FGA           1 -1658.0    2.51 0.11302
## - DREB          1 -1657.7    2.78 0.09533 .
## - FTM           1 -1657.0    3.55 0.05949 .
## - `3PA`         1 -1656.9    3.63 0.05679 .
## - PTS           1 -1656.7    3.83 0.05026 .
## - FGP           1 -1655.4    5.12 0.02365 *
## - `3PP`         1 -1655.2    5.31 0.02121 *
## - PlusMinus    1 -1179.5 481.05 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1325.702
## GAMLSS-RS iteration 2: Global Deviance = -1685.658
## GAMLSS-RS iteration 3: Global Deviance = -1686.177
## GAMLSS-RS iteration 4: Global Deviance = -1686.177
##
## Step:  AIC=-1660.18
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + DREB + TOV + STL +
##       PF + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - DREB
## trying - TOV
## trying - STL
## trying - PF
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - STL       1 -1660.86    1.31 0.25162
## - TOV       1 -1660.73    1.44 0.22976
## <none>      -1660.18
## - PF        1 -1659.63    2.55 0.11026
## - DREB       1 -1659.32    2.86 0.09084 .
## - FGA       1 -1659.26    2.91 0.08782 .
## - `3PA`     1 -1658.65    3.53 0.06033 .
## - FTM       1 -1658.48    3.69 0.05467 .
## - PTS       1 -1658.26    3.92 0.04774 *
## - FGP       1 -1657.16    5.02 0.02506 *
## - `3PP`     1 -1657.12    5.05 0.02456 *
## - PlusMinus 1  -952.27 709.90 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1325.091
## GAMLSS-RS iteration 2: Global Deviance = -1684.345
## GAMLSS-RS iteration 3: Global Deviance = -1684.862
## GAMLSS-RS iteration 4: Global Deviance = -1684.862
##
## Step:  AIC=-1660.86
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + DREB + TOV + PF +

```

```

##      PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - DREB
## trying - TOV
## trying - PF
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - TOV      1 -1662.14    0.72 0.39610
## - DREB      1 -1661.14    1.72 0.18906
## <none>      -1660.86
## - PF        1 -1660.55    2.31 0.12850
## - FGA        1 -1658.73    4.13 0.04205 *
## - `3PA`      1 -1658.29    4.57 0.03251 *
## - FTM        1 -1658.23    4.63 0.03141 *
## - PTS        1 -1657.84    5.02 0.02505 *
## - `3PP`      1 -1657.60    5.27 0.02174 *
## - FGP        1 -1656.60    6.26 0.01237 *
## - PlusMinus  1  -837.69 825.18 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1324.808
## GAMLSS-RS iteration 2: Global Deviance = -1683.626
## GAMLSS-RS iteration 3: Global Deviance = -1684.142
## GAMLSS-RS iteration 4: Global Deviance = -1684.142
##
## Step:  AIC=-1662.14
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + DREB + PF + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - DREB
## trying - PF
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## - DREB      1 -1662.9    1.21 0.27141
## <none>      -1662.1
## - PF        1 -1660.2    3.97 0.04621 *
## - FGA        1 -1659.9    4.23 0.03961 *
## - `3PA`      1 -1659.6    4.52 0.03341 *
## - FTM        1 -1659.5    4.61 0.03180 *
## - PTS        1 -1659.2    4.99 0.02550 *
## - `3PP`      1 -1658.6    5.58 0.01813 *
## - FGP        1 -1658.0    6.14 0.01324 *
## - PlusMinus  1  -784.2 879.95 < 2e-16 ***

```

```
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1324.374
## GAMLSS-RS iteration 2: Global Deviance = -1682.418
## GAMLSS-RS iteration 3: Global Deviance = -1682.932
## GAMLSS-RS iteration 4: Global Deviance = -1682.932
##
## Step:  AIC=-1662.93
## WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + PF + PlusMinus
##
## trying - PTS
## trying - FGA
## trying - FGP
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - PF
## trying - PlusMinus
##           Df      AIC      LRT Pr(Chi)
## <none>      -1662.93
## - FGA       1 -1660.35   4.58 0.03234 *
## - FTM       1 -1660.16   4.77 0.02896 *
## - `3PA`     1 -1660.10   4.83 0.02791 *
## - PTS       1 -1659.81   5.12 0.02367 *
## - PF        1 -1659.78   5.16 0.02316 *
## - `3PP`     1 -1659.27   5.66 0.01734 *
## - FGP       1 -1658.68   6.25 0.01241 *
## - PlusMinus 1  -724.14 940.80 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
##
## Family:  c("BE", "Beta")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PTS + FGA + FGP + `3PA` + `3PP` +
##             FTM + PF + PlusMinus, family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)      PTS      FGA      FGP      `3PA`      `3PP`
##    -7.32808    -0.08135    0.07156    0.15412    0.02814    0.02426
##      FTM      PF      PlusMinus
##    0.07866   -0.01374    0.13087
## Sigma Coefficients:
## (Intercept)
##    -2.466
##
## Degrees of Freedom for the fit: 10 Residual Deg. of Freedom   440
## Global Deviance:      -1682.93
##           AIC:      -1662.93
##           SBC:      -1621.84
```

```
# Call:  gamlss(formula = WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + PF + PlusMinus, family = BE, d
#
# Mu Coefficients:
```

```

#(Intercept)      PTS      FGA      FGP      `3PA`      `3PP`      FTM      PF
# -7.32808      -0.08135      0.07156      0.15412      0.02814      0.02426      0.07866      -0.01374
# Sigma Coefficients:
#   (Intercept)
#   -2.466
#
# Degrees of Freedom for the fit: 10 Residual Deg. of Freedom    440
# Global Deviance:      -1682.93
# AIC:      -1662.93
# SBC:      -1621.84

gamlss_beta_back <- gamlss(formula = WINP ~ PTS + FGA + FGP + `3PA` + `3PP` + FTM + PF + PlusMinus, fam

## GAMLSS-RS iteration 1: Global Deviance = -1324.374
## GAMLSS-RS iteration 2: Global Deviance = -1682.418
## GAMLSS-RS iteration 3: Global Deviance = -1682.932
## GAMLSS-RS iteration 4: Global Deviance = -1682.932

gamlss_beta_back

##
## Family:  c("BE", "Beta")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PTS + FGA + FGP + `3PA` + `3PP` +
##      FTM + PF + PlusMinus, family = BE, data = dados_regressao)
##
## Mu Coefficients:
##   (Intercept)      PTS      FGA      FGP      `3PA`      `3PP`
##   -7.32808      -0.08135      0.07156      0.15412      0.02814      0.02426
##      FTM      PF      PlusMinus
##   0.07866      -0.01374      0.13087
## Sigma Coefficients:
##   (Intercept)
##   -2.466
##
## Degrees of Freedom for the fit: 10 Residual Deg. of Freedom    440
## Global Deviance:      -1682.93
## AIC:      -1662.93
## SBC:      -1621.84

coef(gamlss_beta_back)

##   (Intercept)      PTS      FGA      FGP      `3PA`      `3PP`
## -7.32807794 -0.08134874  0.07155544  0.15412494  0.02813583  0.02426470
##      FTM      PF      PlusMinus
##   0.07866282 -0.01374419  0.13086671

summary(gamlss_beta_back) #AIC:      -1662.933

## *****
## Family:  c("BE", "Beta")
##
## Call:  gamlss(formula = WINP ~ PTS + FGA + FGP + `3PA` + `3PP` +
##      FTM + PF + PlusMinus, family = BE, data = dados_regressao)
##

```

```

## Fitting method: RS()
##
## -----
## Mu link function:  logit
## Mu Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) -7.328078   3.054111 -2.399  0.0168 *
## PTS         -0.081349   0.035186 -2.312  0.0212 *
## FGA          0.071555   0.032669  2.190  0.0290 *
## FGP          0.154125   0.060019  2.568  0.0106 *
## `3PA`        0.028136   0.012448  2.260  0.0243 *
## `3PP`        0.024265   0.010020  2.422  0.0159 *
## FTM          0.078663   0.035027  2.246  0.0252 *
## PF          -0.013744   0.006034 -2.278  0.0232 *
## PlusMinus    0.130867   0.002395 54.644 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function:  logit
## Sigma Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) -2.46575   0.03696 -66.72 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit:  450
## Degrees of Freedom for the fit:  10
##      Residual Deg. of Freedom:  440
##                      at cycle:  4
##
## Global Deviance:      -1682.933
##      AIC:              -1662.933
##      SBC:              -1621.84
## *****
##### Normal #####
gamlss.family(NO)

##
## GAMLSS Family: NO Normal
## Link function for mu   : identity
## Link function for sigma: log
#### Modelo Completo família normal ####
modelo_gamlssN <- gamlss(WINP ~ ., data = dados_regressao, family = NO)

## GAMLSS-RS iteration 1: Global Deviance = -1740.945
## GAMLSS-RS iteration 2: Global Deviance = -1740.945
modelo_gamlssN

##
## Family:  c("NO", "Normal")
## Fitting method: RS()

```

```
##
## Call:  gamlss(formula = WINP ~ ., family = NO, data = dados_regressao)
##
## Mu Coefficients:
##           (Intercept)           TEAMBoston Celtics
##           0.3849344           -0.0120250
##           TEAMBrooklyn Nets       TEAMCharlotte Bobcats
##           0.0039617           0.0133796
##           TEAMCharlotte Hornets    TEAMChicago Bulls
##           -0.0145005           0.0084856
##           TEAMCleveland Cavaliers  TEAMDallas Mavericks
##           0.0039967           -0.0185095
##           TEAMDenver Nuggets       TEAMDetroit Pistons
##           0.0024464           -0.0340194
##           TEAMGolden State Warriors TEAMHouston Rockets
##           -0.0212880           0.0120925
##           TEAMIndiana Pacers       TEAMLA Clippers
##           -0.0059713           -0.0083375
##           TEAMLos Angeles Clippers TEAMLos Angeles Lakers
##           -0.0188479           0.0052288
##           TEAMMemphis Grizzlies    TEAMMiami Heat
##           0.0102977           -0.0047578
##           TEAMMilwaukee Bucks      TEAMMinnesota Timberwolves
##           -0.0192852           -0.0476085
##           TEAMNew Jersey Nets      TEAMNew Orleans Hornets
##           -0.0340128           -0.0243073
##           TEAMNew Orleans Pelicans  TEAMNew York Knicks
##           -0.0384255           -0.0247466
##           TEAMOklahoma City Thunder TEAMOrlando Magic
##           0.0034222           -0.0196853
##           TEAMPhiladelphia 76ers    TEAMPhoenix Suns
##           -0.0165407           -0.0043497
##           TEAMPortland Trail Blazers TEAMSacramento Kings
##           0.0109588           -0.0181920
##           TEAMSan Antonio Spurs     TEAMToronto Raptors
##           -0.0117354           -0.0127437
##           TEAMUtah Jazz             TEAMWashington Wizards
##           -0.0294224           -0.0194735
##           PTS                      FGM
##           -0.0201604           0.0275384
##           FGA                      FGP
##           0.0001698           0.0172859
##           `3PM`                   `3PA`
##           0.0127936           0.0031094
##           `3PP`                   FTM
##           0.0044865           0.0577332
##           FTA                      FTP
##           -0.0316353           -0.0086342
##           OREB                     DREB
##           0.0629313           0.0631626
##           REB                      AST
##           -0.0552165           0.0017278
##           TOV                      STL
##           -0.0097114           0.0112387
```



```

##          BLK          BLKA
##      -0.0008269      -0.0052525
##          PF          PFD
##      -0.0019238          0.0055098
##      PlusMinus      Numero_temporada2
##      0.0258603          0.0076547
##      Numero_temporada3      Numero_temporada4
##      0.0057990          0.0121886
##      Numero_temporada5      Numero_temporada6
##      0.0003925          0.0004200
##      Numero_temporada7      Numero_temporada8
##      0.0048858          0.0006137
##      Numero_temporada9      Numero_temporada10
##      -0.0010696          -0.0030638
##      Numero_temporada11      Numero_temporada12
##      -0.0004315          0.0003404
##      Numero_temporada13      Numero_temporada14
##      -0.0050765          -0.0067826
##      Numero_temporada15
##      0.0017315
## Sigma Coefficients:
## (Intercept)
##      -3.353
##
## Degrees of Freedom for the fit: 70 Residual Deg. of Freedom   380
## Global Deviance:      -1740.95
##      AIC:      -1600.95
##      SBC:      -1313.3

```

```
coef(modelo_gamlssN)
```

```

##      (Intercept)      TEAMBoston Celtics
##      0.3849343849      -0.0120249534
##      TEAMBrooklyn Nets      TEAMCharlotte Bobcats
##      0.0039616737          0.0133796093
##      TEAMCharlotte Hornets      TEAMChicago Bulls
##      -0.0145004842          0.0084856042
##      TEAMCleveland Cavaliers      TEAMDallas Mavericks
##      0.0039967279          -0.0185095205
##      TEAMDenver Nuggets      TEAMDetroit Pistons
##      0.0024463625          -0.0340193950
##      TEAMGolden State Warriors      TEAMHouston Rockets
##      -0.0212880488          0.0120925104
##      TEAMIndiana Pacers      TEAMLA Clippers
##      -0.0059713348          -0.0083374706
##      TEAMLos Angeles Clippers      TEAMLos Angeles Lakers
##      -0.0188478561          0.0052288163
##      TEAMMemphis Grizzlies      TEAMMiami Heat
##      0.0102977052          -0.0047578049
##      TEAMMilwaukee Bucks      TEAMMinnesota Timberwolves
##      -0.0192852414          -0.0476084851
##      TEAMNew Jersey Nets      TEAMNew Orleans Hornets
##      -0.0340127827          -0.0243073352
##      TEAMNew Orleans Pelicans      TEAMNew York Knicks
##      -0.0384255145          -0.0247465856

```

## TEAMOklahoma City Thunder	TEAMOrlando Magic
## 0.0034222224	-0.0196853375
## TEAMPhiladelphia 76ers	TEAMPhoenix Suns
## -0.0165407145	-0.0043497439
## TEAMPortland Trail Blazers	TEAMSacramento Kings
## 0.0109587608	-0.0181920093
## TEAMSan Antonio Spurs	TEAMToronto Raptors
## -0.0117354013	-0.0127437317
## TEAMUtah Jazz	TEAMWashington Wizards
## -0.0294224498	-0.0194734725
## PTS	FGM
## -0.0201603689	0.0275384184
## FGA	FGP
## 0.0001697572	0.0172859360
## `3PM`	`3PA`
## 0.0127935937	0.0031094284
## `3PP`	FTM
## 0.0044864691	0.0577332209
## FTA	FTP
## -0.0316353188	-0.0086341618
## OREB	DREB
## 0.0629312660	0.0631626382
## REB	AST
## -0.0552164560	0.0017278023
## TOV	STL
## -0.0097113923	0.0112387161
## BLK	BLKA
## -0.0008268940	-0.0052525500
## PF	PFD
## -0.0019237932	0.0055097514
## PlusMinus	Numero_temporada2
## 0.0258603172	0.0076547454
## Numero_temporada3	Numero_temporada4
## 0.0057989724	0.0121885856
## Numero_temporada5	Numero_temporada6
## 0.0003925166	0.0004200458
## Numero_temporada7	Numero_temporada8
## 0.0048857968	0.0006136884
## Numero_temporada9	Numero_temporada10
## -0.0010696264	-0.0030638442
## Numero_temporada11	Numero_temporada12
## -0.0004315481	0.0003404450
## Numero_temporada13	Numero_temporada14
## -0.0050764532	-0.0067826279
## Numero_temporada15	
## 0.0017314545	

```
summary(modelo_gamlssN)
```

```
## *****
## Family:  c("NO", "Normal")
##
## Call:  gamlss(formula = WINP ~ ., family = NO, data = dados_regressao)
##
## Fitting method: RS()
```

```

##
## -----
## Mu link function: identity
## Mu Coefficients:
##
## Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.3849344 1.2346217 0.312 0.755376
## TEAMBoston Celtics -0.0120250 0.0134058 -0.897 0.370289
## TEAMBrooklyn Nets 0.0039617 0.0143299 0.276 0.782344
## TEAMCharlotte Bobcats 0.0133796 0.0187023 0.715 0.474803
## TEAMCharlotte Hornets -0.0145005 0.0155736 -0.931 0.352395
## TEAMChicago Bulls 0.0084856 0.0135136 0.628 0.530427
## TEAMCleveland Cavaliers 0.0039967 0.0132855 0.301 0.763705
## TEAMDallas Mavericks -0.0185095 0.0139102 -1.331 0.184103
## TEAMDenver Nuggets 0.0024464 0.0134714 0.182 0.855996
## TEAMDetroit Pistons -0.0340194 0.0139932 -2.431 0.015513 *
## TEAMGolden State Warriors -0.0212880 0.0141872 -1.501 0.134312
## TEAMHouston Rockets 0.0120925 0.0138921 0.870 0.384600
## TEAMIndiana Pacers -0.0059713 0.0134284 -0.445 0.656804
## TEAMLA Clippers -0.0083375 0.0164677 -0.506 0.612944
## TEAMLos Angeles Clippers -0.0188479 0.0171424 -1.099 0.272251
## TEAMLos Angeles Lakers 0.0052288 0.0134771 0.388 0.698250
## TEAMMemphis Grizzlies 0.0102977 0.0138220 0.745 0.456719
## TEAMMiami Heat -0.0047578 0.0136310 -0.349 0.727251
## TEAMMilwaukee Bucks -0.0192852 0.0132216 -1.459 0.145496
## TEAMMinnesota Timberwolves -0.0476085 0.0133668 -3.562 0.000415 ***
## TEAMNew Jersey Nets -0.0340128 0.0209876 -1.621 0.105929
## TEAMNew Orleans Hornets -0.0243073 0.0190439 -1.276 0.202598
## TEAMNew Orleans Pelicans -0.0384255 0.0148332 -2.591 0.009952 **
## TEAMNew York Knicks -0.0247466 0.0136851 -1.808 0.071352 .
## TEAMOklahoma City Thunder 0.0034222 0.0144161 0.237 0.812483
## TEAMOrlando Magic -0.0196853 0.0133762 -1.472 0.141937
## TEAMPhiladelphia 76ers -0.0165407 0.0135693 -1.219 0.223606
## TEAMPhoenix Suns -0.0043497 0.0137274 -0.317 0.751520
## TEAMPortland Trail Blazers 0.0109588 0.0137310 0.798 0.425308
## TEAMSacramento Kings -0.0181920 0.0135544 -1.342 0.180349
## TEAMSan Antonio Spurs -0.0117354 0.0133387 -0.880 0.379522
## TEAMToronto Raptors -0.0127437 0.0135686 -0.939 0.348221
## TEAMUtah Jazz -0.0294224 0.0134983 -2.180 0.029892 *
## TEAMWashington Wizards -0.0194735 0.0135965 -1.432 0.152898
## PTS -0.0201604 0.0238687 -0.845 0.398846
## FGM 0.0275384 0.0482350 0.571 0.568390
## FGA 0.0001698 0.0139398 0.012 0.990290
## FGP 0.0172859 0.0249258 0.693 0.488423
## `3PM` 0.0127936 0.0279052 0.458 0.646880
## `3PA` 0.0031094 0.0052114 0.597 0.551087
## `3PP` 0.0044865 0.0036035 1.245 0.213887
## FTM 0.0577332 0.0301271 1.916 0.056074 .
## FTA -0.0316353 0.0185169 -1.708 0.088369 .
## FTP -0.0086342 0.0055763 -1.548 0.122368
## OREB 0.0629313 0.0352766 1.784 0.075232 .
## DREB 0.0631626 0.0350413 1.803 0.072256 .
## REB -0.0552165 0.0348328 -1.585 0.113756
## AST 0.0017278 0.0015717 1.099 0.272313
## TOV -0.0097114 0.0036505 -2.660 0.008138 **

```

```

## STL                0.0112387  0.0040363   2.784 0.005630 **
## BLK                -0.0008269  0.0028274  -0.292 0.770094
## BLKA              -0.0052525  0.0041433  -1.268 0.205670
## PF                -0.0019238  0.0018142  -1.060 0.289622
## PFD               0.0055098  0.0036133   1.525 0.128129
## PlusMinus         0.0258603  0.0014767  17.512 < 2e-16 ***
## Numero_temporada2  0.0076547  0.0095898   0.798 0.425242
## Numero_temporada3  0.0057990  0.0094591   0.613 0.540205
## Numero_temporada4  0.0121886  0.0109245   1.116 0.265251
## Numero_temporada5  0.0003925  0.0103793   0.038 0.969853
## Numero_temporada6  0.0004200  0.0100309   0.042 0.966620
## Numero_temporada7  0.0048858  0.0110105   0.444 0.657483
## Numero_temporada8  0.0006137  0.0117952   0.052 0.958533
## Numero_temporada9 -0.0010696  0.0127884  -0.084 0.933386
## Numero_temporada10 -0.0030638  0.0143199  -0.214 0.830695
## Numero_temporada11 -0.0004315  0.0168276  -0.026 0.979554
## Numero_temporada12  0.0003404  0.0171394   0.020 0.984163
## Numero_temporada13 -0.0050765  0.0183008  -0.277 0.781632
## Numero_temporada14 -0.0067826  0.0184118  -0.368 0.712792
## Numero_temporada15  0.0017315  0.0173935   0.100 0.920757
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function:  log
## Sigma Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) -3.35332    0.03333  -100.6  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit:  450
## Degrees of Freedom for the fit:  70
##      Residual Deg. of Freedom:  380
##                      at cycle:  2
##
## Global Deviance:    -1740.945
##      AIC:           -1600.945
##      SBC:           -1313.298
## *****
##AIC:      -1624.372

###Modelo normal com variáveis significativas 10% ###
modelo_gamlssN1 <- gamlss(WINP ~ TOV + STL + PF + PlusMinus, data = dados_regressao, family = NO)

## GAMLSS-RS iteration 1: Global Deviance = -1648.776
## GAMLSS-RS iteration 2: Global Deviance = -1648.776
modelo_gamlssN1

##
## Family:  c("NO", "Normal")
## Fitting method: RS()
##

```

```
## Call:  gamlss(formula = WINP ~ TOV + STL + PF + PlusMinus,
##       family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)          TOV          STL          PF          PlusMinus
##  5.650e-01   -4.755e-05   5.647e-04   -3.392e-03   3.107e-02
## Sigma Coefficients:
## (Intercept)
##    -3.251
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
## Global Deviance:      -1648.78
##           AIC:      -1636.78
##           SBC:      -1612.12
```

```
coef(modelo_gamlssN1)
```

```
## (Intercept)          TOV          STL          PF          PlusMinus
## 5.649862e-01 -4.754703e-05 5.647343e-04 -3.392285e-03 3.107400e-02
```

```
summary(modelo_gamlssN1) #STL não foi significativo
```

```
## *****
## Family:  c("NO", "Normal")
##
## Call:  gamlss(formula = WINP ~ TOV + STL + PF + PlusMinus,
##       family = NO, data = dados_regressao)
##
## Fitting method: RS()
##
## -----
## Mu link function:  identity
## Mu Coefficients:
##           Estimate Std. Error t value Pr(>|t|)
## (Intercept)  5.650e-01  3.274e-02  17.255  <2e-16 ***
## TOV         -4.755e-05  1.881e-03  -0.025  0.9798
## STL         5.647e-04  2.334e-03   0.242  0.8089
## PF         -3.392e-03  1.413e-03  -2.400  0.0168 *
## PlusMinus   3.107e-02  4.262e-04  72.908  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function:  log
## Sigma Coefficients:
##           Estimate Std. Error t value Pr(>|t|)
## (Intercept) -3.25091    0.03333  -97.53  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit: 450
## Degrees of Freedom for the fit: 6
##       Residual Deg. of Freedom: 444
##               at cycle: 2
```

```

##
## Global Deviance:      -1648.777
##           AIC:        -1636.777
##           SBC:        -1612.121
## *****

#AIC:      -1638.776

##### Forward Selection Normal #####
gamlss_completoN = gamlss(WINP ~ ., data = dados_regressao, family = NO)

## GAMLSS-RS iteration 1: Global Deviance = -1740.945
## GAMLSS-RS iteration 2: Global Deviance = -1740.945

gamlss_vazioN = gamlss(WINP ~ 1, data = dados_regressao, family = NO)

## GAMLSS-RS iteration 1: Global Deviance = -427.5666
## GAMLSS-RS iteration 2: Global Deviance = -427.5666

step(gamlss_vazioN, scope=list(upper=gamlss_completoN, lower=gamlss_vazioN), direction='forward', trace=

## Start:  AIC=-423.57
## WINP ~ 1
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
## trying - Numero_temporada

##           Df      AIC      LRT    Pr(Chi)
## + PlusMinus      1 -1636.39 1214.82 < 2.2e-16 ***
## + FGP            1  -627.51  205.94 < 2.2e-16 ***
## + `3PP`          1  -578.12  156.55 < 2.2e-16 ***
## + BLKA           1  -534.89  113.32 < 2.2e-16 ***
## + DREB           1  -474.57   53.01 3.323e-13 ***
## + TEAM          33  -467.53  109.96 3.314e-10 ***
## + PTS           1  -466.89   45.32 1.670e-11 ***
## + TOV           1  -460.40   38.84 4.607e-10 ***

```

```

## + FGM          1 -459.24   37.68 8.354e-10 ***
## + AST          1 -455.72   34.16 5.082e-09 ***
## + REB          1 -452.76   31.20 2.332e-08 ***
## + BLK          1 -452.01   30.44 3.444e-08 ***
## + PF           1 -441.52   19.95 7.950e-06 ***
## + `3PM`        1 -439.54   17.98 2.235e-05 ***
## + FTP          1 -435.83   14.27 0.0001588 ***
## + FTM          1 -435.38   13.82 0.0002015 ***
## + STL          1 -433.26   11.69 0.0006277 ***
## + OREB         1 -430.12    8.55 0.0034548 **
## + PFD          1 -428.70    7.13 0.0075777 **
## + `3PA`        1 -427.45    5.88 0.0152848 *
## + FTA          1 -427.17    5.61 0.0178987 *
## + FGA          1 -425.48    3.92 0.0477633 *
## <none>         -423.57
## + Numero_temporada 14 -395.60    0.03 1.0000000
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1642.391
## GAMLSS-RS iteration 2: Global Deviance = -1642.391
##
## Step:  AIC=-1636.39
## WINP ~ PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - Numero_temporada
##
##          Df      AIC      LRT  Pr(Chi)
## + PF          1 -1640.7   6.327 0.011894 *
## + OREB         1 -1639.8   5.405 0.020083 *
## + FGP          1 -1638.7   4.296 0.038203 *
## + FGA          1 -1637.3   2.923 0.087328 .
## + REB          1 -1636.6   2.204 0.137652
## + BLKA         1 -1636.6   2.176 0.140169
## <none>         -1636.4

```

```

## + `3PP`          1 -1636.1  1.666 0.196819
## + `3PA`          1 -1635.1  0.730 0.392937
## + TOV            1 -1635.0  0.627 0.428366
## + PTS            1 -1634.9  0.529 0.467031
## + `3PM`          1 -1634.9  0.527 0.468003
## + FTA            1 -1634.8  0.430 0.511818
## + FTM            1 -1634.8  0.404 0.524915
## + BLK            1 -1634.8  0.383 0.536075
## + PFD            1 -1634.7  0.279 0.597232
## + FGM            1 -1634.5  0.139 0.709484
## + STL            1 -1634.5  0.136 0.712686
## + AST            1 -1634.4  0.032 0.857264
## + DREB           1 -1634.4  0.009 0.923329
## + FTP            1 -1634.4  0.003 0.958722
## + TEAM           33 -1631.4 61.030 0.002121 **
## + Numero_temporada 14 -1608.4  0.009 1.000000
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1648.718
## GAMLSS-RS iteration 2: Global Deviance = -1648.718
##
## Step:  AIC=-1640.72
## WINP ~ PlusMinus + PF
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PFD
## trying - Numero_temporada
##
##          Df      AIC      LRT  Pr(Chi)
## + FGP          1 -1643.2  4.530 0.033314 *
## + OREB          1 -1642.6  3.870 0.049164 *
## + FGA          1 -1642.0  3.240 0.071843 .
## + REB          1 -1641.6  2.925 0.087211 .
## <none>          -1640.7
## + `3PP`          1 -1640.6  1.873 0.171153
## + BLKA          1 -1640.2  1.516 0.218161
## + `3PA`          1 -1639.8  1.113 0.291505

```



```

## + `3PM`          1 -1639.6  0.846 0.357664
## + PTS            1 -1639.1  0.371 0.542605
## + DREB           1 -1639.0  0.304 0.581507
## + PFD            1 -1639.0  0.273 0.601625
## + FGM            1 -1638.9  0.178 0.673198
## + BLK            1 -1638.8  0.117 0.732861
## + FTM            1 -1638.8  0.066 0.797229
## + FTA            1 -1638.8  0.060 0.805859
## + STL            1 -1638.8  0.058 0.809268
## + FTP            1 -1638.7  0.006 0.935782
## + AST            1 -1638.7  0.003 0.960114
## + TOV            1 -1638.7  0.000 0.984922
## + TEAM           33 -1632.7 58.018 0.004563 **
## + Numero_temporada 14 -1613.9  1.177 0.999997
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1653.247
## GAMLSS-RS iteration 2: Global Deviance = -1653.247
##
## Step:  AIC=-1643.25
## WINP ~ PlusMinus + PF + FGP
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PFD
## trying - Numero_temporada
##
##           Df      AIC      LRT  Pr(Chi)
## + FGM          1 -1646.4  5.193 0.022681 *
## + FGA          1 -1646.2  4.984 0.025578 *
## + PTS          1 -1645.3  4.106 0.042730 *
## + REB          1 -1643.4  2.124 0.145037
## + `3PA`        1 -1643.3  2.067 0.150477
## + AST          1 -1643.3  2.026 0.154614
## <none>         -1643.2
## + `3PM`        1 -1643.2  1.982 0.159182
## + OREB          1 -1642.8  1.521 0.217427
## + BLKA          1 -1641.9  0.665 0.414839
## + DREB          1 -1641.9  0.614 0.433269

```

```

## + `3PP`          1 -1641.7  0.468 0.494129
## + PFD             1 -1641.6  0.363 0.546994
## + FTP             1 -1641.4  0.175 0.675762
## + BLK             1 -1641.3  0.103 0.748601
## + STL             1 -1641.3  0.059 0.808310
## + FTA             1 -1641.3  0.055 0.814947
## + TOV             1 -1641.3  0.053 0.818363
## + FTM             1 -1641.3  0.013 0.910100
## + TEAM            33 -1635.1 57.879 0.004723 **
## + Numero_temporada 14 -1618.4  3.184 0.998702
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1658.44
## GAMLSS-RS iteration 2: Global Deviance = -1658.44
##
## Step:  AIC=-1646.44
## WINP ~ PlusMinus + PF + FGP + FGM
##
## trying - TEAM
## trying - PTS
## trying - FGA
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PFD
## trying - Numero_temporada
##
##          Df      AIC      LRT  Pr(Chi)
## <none>          -1646.4
## + DREB          1 -1645.8  1.368 0.242082
## + FGA           1 -1645.5  1.113 0.291331
## + OREB          1 -1645.5  1.009 0.315168
## + `3PP`         1 -1644.8  0.389 0.532873
## + STL           1 -1644.8  0.344 0.557662
## + TOV           1 -1644.8  0.344 0.557726
## + BLKA          1 -1644.7  0.304 0.581651
## + REB           1 -1644.6  0.128 0.720630
## + `3PA`         1 -1644.6  0.123 0.725672
## + `3PM`         1 -1644.5  0.101 0.750067
## + BLK           1 -1644.5  0.095 0.757953
## + FTA           1 -1644.5  0.077 0.781021
## + PFD           1 -1644.5  0.076 0.782247
## + FTM           1 -1644.5  0.062 0.802608
## + AST           1 -1644.5  0.005 0.942778

```

```

## + FTP          1 -1644.4  0.005 0.943992
## + PTS          1 -1644.4  0.004 0.950023
## + TEAM         33 -1637.1 56.705 0.006302 **
## + Numero_temporada 14 -1622.1  3.653 0.997218
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

##
## Family: c("NO", "Normal")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM,
##             family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)  PlusMinus          PF          FGP          FGM
##    0.401565    0.030261   -0.003478    0.005746   -0.002433
## Sigma Coefficients:
## (Intercept)
##    -3.262
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
## Global Deviance:      -1658.44
## AIC:      -1646.44
## SBC:      -1621.78

# Call:  gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM,          family = NO, data = dados_regressao)
#
# Mu Coefficients:
# (Intercept)  PlusMinus          PF          FGP          FGM
# 0.401565    0.030261   -0.003478    0.005746   -0.002433
# Sigma Coefficients:
# (Intercept)
# -3.262
#
# Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
# Global Deviance:      -1658.44
# AIC:      -1646.44
# SBC:      -1621.78

gamlss_normal_forw <- gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM, family = NO, data = dados_reg

## GAMLSS-RS iteration 1: Global Deviance = -1658.44
## GAMLSS-RS iteration 2: Global Deviance = -1658.44

gamlss_normal_forw

##
## Family: c("NO", "Normal")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM,
##             family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)  PlusMinus          PF          FGP          FGM

```

```

##      0.401565      0.030261      -0.003478      0.005746      -0.002433
## Sigma Coefficients:
## (Intercept)
##      -3.262
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
## Global Deviance:      -1658.44
##      AIC:      -1646.44
##      SBC:      -1621.78
coef(gamlss_normal_forw)

## (Intercept)      PlusMinus      PF      FGP      FGM
## 0.401564997 0.030260547 -0.003477604 0.005745605 -0.002433190
summary(gamlss_normal_forw) #-1646.44

## *****
## Family: c("NO", "Normal")
##
## Call: gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM,
## family = NO, data = dados_regressao)
##
## Fitting method: RS()
##
## -----
## Mu link function: identity
## Mu Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.4015650 0.0714772 5.618 3.41e-08 ***
## PlusMinus 0.0302605 0.0005029 60.170 < 2e-16 ***
## PF -0.0034776 0.0013037 -2.667 0.00792 **
## FGP 0.0057456 0.0018499 3.106 0.00202 **
## FGM -0.0024332 0.0010647 -2.285 0.02276 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function: log
## Sigma Coefficients:
##      Estimate Std. Error t value Pr(>|t|)
## (Intercept) -3.26165 0.03333 -97.85 <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit: 450
## Degrees of Freedom for the fit: 6
##      Residual Deg. of Freedom: 444
##      at cycle: 2
##
## Global Deviance:      -1658.44
##      AIC:      -1646.44
##      SBC:      -1621.784
## *****

```

```
##### backward regression Normal #####
gamlss_completoN = gamlss(WINP ~ ., data = dados_regressao, family = NO)

## GAMLSS-RS iteration 1: Global Deviance = -1740.945
## GAMLSS-RS iteration 2: Global Deviance = -1740.945

gamlss_vazioN = gamlss(WINP ~ 1, data = dados_regressao, family = NO)

## GAMLSS-RS iteration 1: Global Deviance = -427.5666
## GAMLSS-RS iteration 2: Global Deviance = -427.5666

step(gamlss_completoN, scope=list(upper=gamlss_completoN, lower=gamlss_vazioN), direction='backward', t

## Start: AIC=-1600.95
## WINP ~ TEAM + PTS + FGM + FGA + FGP + `3PM` + `3PA` + `3PP` +
## FTM + FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLK +
## BLKA + PF + PFD + PlusMinus + Numero_temporada
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
## trying - Numero_temporada
##
## Df AIC LRT Pr(Chi)
## - Numero_temporada 14 -1625.6 3.350 0.9982725
## - FGA 1 -1602.9 0.000 0.9902837
## - BLK 1 -1602.9 0.086 0.7699453
## - `3PM` 1 -1602.7 0.210 0.6466561
## - FGM 1 -1602.6 0.326 0.5681230
## - `3PA` 1 -1602.6 0.356 0.5508106
## - FGP 1 -1602.5 0.481 0.4881153
## - PTS 1 -1602.2 0.713 0.3985015
## - PF 1 -1601.8 1.123 0.2892495
## - AST 1 -1601.7 1.207 0.2719381
## - `3PP` 1 -1601.4 1.547 0.2135133
## - BLKA 1 -1601.3 1.604 0.2052972
## <none> -1601.0
```

```

## - PFD          1 -1600.6    2.319 0.1277884
## - FTP          1 -1600.5    2.391 0.1220310
## - REB          1 -1600.4    2.506 0.1134266
## - FTA          1 -1600.0    2.909 0.0880654 .
## - OREB         1 -1599.8    3.171 0.0749460 .
## - DREB         1 -1599.7    3.237 0.0719746 .
## - FTM          1 -1599.3    3.657 0.0558213 .
## - TEAM        33 -1598.4   68.524 0.0002755 ***
## - TOV          1 -1595.9    7.022 0.0080510 **
## - STL          1 -1595.3    7.687 0.0055619 **
## - PlusMinus    1 -1369.1  233.853 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1737.595
## GAMLSS-RS iteration 2: Global Deviance = -1737.595
##
## Step:  AIC=-1625.59
## WINP ~ TEAM + PTS + FGM + FGA + FGP + `3PM` + `3PA` + `3PP` +
##       FTM + FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLK +
##       BLKA + PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGA
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT   Pr(Chi)
## - FGA       1 -1627.6    0.00 0.9507435
## - BLK       1 -1627.5    0.14 0.7118379
## - `3PA`     1 -1627.4    0.21 0.6430780
## - `3PM`     1 -1627.4    0.23 0.6305249
## - FGP       1 -1627.3    0.25 0.6163238
## - FGM       1 -1627.2    0.43 0.5123576
## - PTS       1 -1626.9    0.68 0.4089033
## - AST       1 -1626.6    1.04 0.3088721
## - `3PP`     1 -1626.5    1.06 0.3027290
## - PF        1 -1626.2    1.40 0.2372509

```

```

## - PFD      1 -1625.7    1.88 0.1706088
## - REB      1 -1625.7    1.93 0.1652317
## - BLKA     1 -1625.6    1.96 0.1620356
## <none>     -1625.6
## - OREB     1 -1625.2    2.40 0.1217108
## - DREB     1 -1625.1    2.46 0.1170552
## - FTP      1 -1624.6    2.96 0.0855855 .
## - FTA      1 -1624.4    3.22 0.0726567 .
## - TEAM     33 -1624.4   67.22 0.0003978 ***
## - FTM      1 -1623.6    4.00 0.0455612 *
## - TOV      1 -1621.5    6.12 0.0133392 *
## - STL      1 -1620.8    6.82 0.0090046 **
## - PlusMinus 1 -1254.4 373.23 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1737.591
## GAMLSS-RS iteration 2: Global Deviance = -1737.591
##
## Step:  AIC=-1627.59
## WINP ~ TEAM + PTS + FGM + FGP + `3PM` + `3PA` + `3PP` + FTM +
##       FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLK + BLKA +
##       PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLK
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##
##      Df      AIC      LRT    Pr(Chi)
## - BLK      1 -1629.5    0.14  0.710406
## - `3PA`     1 -1629.4    0.21  0.643546
## - `3PM`     1 -1629.3    0.30  0.581825
## - FGM      1 -1629.2    0.44  0.505591
## - PTS      1 -1628.8    0.79  0.372766
## - AST      1 -1628.6    1.03  0.309385
## - `3PP`     1 -1628.5    1.10  0.293987
## - PF       1 -1628.2    1.41  0.235319
## - PFD      1 -1627.7    1.87  0.171038

```

```

## - REB      1 -1627.7    1.92  0.165627
## - BLKA     1 -1627.6    1.98  0.159254
## <none>      -1627.6
## - OREB     1 -1627.2    2.39  0.121871
## - DREB     1 -1627.1    2.45  0.117219
## - FTP      1 -1626.6    2.96  0.085550 .
## - FTA      1 -1626.4    3.22  0.072595 .
## - TEAM     33 -1626.3   67.27  0.000392 ***
## - FTM      1 -1625.4    4.20  0.040361 *
## - TOV      1 -1623.4    6.22  0.012641 *
## - STL      1 -1622.5    7.12  0.007620 **
## - FGP      1 -1621.2    8.38  0.003799 **
## - PlusMinus 1 -1248.8 380.80 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1737.453
## GAMLSS-RS iteration 2: Global Deviance = -1737.453
##
## Step:  AIC=-1629.45
## WINP ~ TEAM + PTS + FGM + FGP + `3PM` + `3PA` + `3PP` + FTM +
##       FTA + FTP + OREB + DREB + REB + AST + TOV + STL + BLKA +
##       PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGP
## trying - `3PM`
## trying - `3PA`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##
##      Df      AIC      LRT    Pr(Chi)
## - `3PA`    1 -1631.2    0.21 0.6484737
## - `3PM`    1 -1631.1    0.31 0.5773621
## - FGM      1 -1631.0    0.44 0.5067727
## - PTS      1 -1630.7    0.79 0.3729765
## - AST      1 -1630.4    1.02 0.3120947
## - `3PP`    1 -1630.4    1.09 0.2955499
## - PF       1 -1630.0    1.49 0.2215359
## - REB      1 -1629.5    1.94 0.1640334
## - BLKA     1 -1629.5    1.96 0.1610329
## <none>      -1629.5

```



```

## - PFD      1 -1629.3    2.17 0.1404397
## - OREB     1 -1629.0    2.41 0.1204947
## - DREB     1 -1629.0    2.47 0.1163292
## - FTP      1 -1628.5    2.94 0.0861702 .
## - TEAM    33 -1628.3   67.17 0.0004031 ***
## - FTA      1 -1628.2    3.24 0.0718287 .
## - FTM      1 -1627.3    4.20 0.0405098 *
## - TOV      1 -1625.0    6.46 0.0110299 *
## - STL      1 -1624.4    7.08 0.0078033 **
## - FGP      1 -1623.0    8.47 0.0036162 **
## - PlusMinus 1 -1246.9 384.59 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1737.245
## GAMLSS-RS iteration 2: Global Deviance = -1737.245
##
## Step:  AIC=-1631.25
## WINP ~ TEAM + PTS + FGM + FGP + `3PM` + `3PP` + FTM + FTA + FTP +
##       OREB + DREB + REB + AST + TOV + STL + BLKA + PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGM
## trying - FGP
## trying - `3PM`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##
##      Df      AIC      LRT   Pr(Chi)
## - FGM      1 -1632.9    0.39 0.5329917
## - PTS      1 -1632.5    0.73 0.3938698
## - `3PM`     1 -1632.5    0.74 0.3908199
## - AST      1 -1632.2    1.10 0.2942560
## - PF       1 -1631.8    1.42 0.2336679
## - BLKA     1 -1631.3    1.96 0.1617403
## <none>      -1631.2
## - REB      1 -1631.2    2.01 0.1567578
## - `3PP`     1 -1631.2    2.01 0.1566737
## - PFD      1 -1631.0    2.27 0.1320217
## - OREB     1 -1630.8    2.49 0.1149099
## - DREB     1 -1630.7    2.56 0.1097689
## - FTP      1 -1630.0    3.29 0.0696110 .
## - FTA      1 -1629.7    3.56 0.0591219 .

```

```

## - FTM      1 -1628.9   4.30 0.0381056 *
## - TEAM    33 -1628.8  68.48 0.0002788 ***
## - TOV      1 -1626.5   6.71 0.0095834 **
## - STL      1 -1625.7   7.59 0.0058683 **
## - FGP      1 -1624.8   8.45 0.0036425 **
## - PlusMinus 1 -1244.9 388.36 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1736.857
## GAMLSS-RS iteration 2: Global Deviance = -1736.857
##
## Step:  AIC=-1632.86
## WINP ~ TEAM + PTS + FGP + `3PM` + `3PP` + FTM + FTA + FTP + OREB +
##       DREB + REB + AST + TOV + STL + BLKA + PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - AST
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT   Pr(Chi)
## - AST      1 -1633.7    1.12 0.289576
## - PF       1 -1633.5    1.37 0.241970
## - REB      1 -1633.0    1.85 0.173815
## - BLKA     1 -1632.9    1.92 0.165412
## <none>      -1632.9
## - `3PP`    1 -1632.8    2.01 0.156537
## - OREB     1 -1632.5    2.32 0.127560
## - DREB     1 -1632.5    2.39 0.121818
## - PFD      1 -1632.3    2.52 0.112696
## - `3PM`    1 -1631.7    3.12 0.077550 .
## - FTP      1 -1631.1    3.79 0.051496 .
## - TEAM    33 -1630.8   68.11 0.000310 ***
## - FTA      1 -1630.7    4.16 0.041510 *
## - FTM      1 -1630.2    4.61 0.031739 *
## - TOV      1 -1628.0    6.85 0.008859 **
## - PTS      1 -1627.4    7.50 0.006182 **
## - STL      1 -1627.2    7.68 0.005582 **
## - FGP      1 -1625.8    9.01 0.002679 **
## - PlusMinus 1 -1246.2 388.62 < 2.2e-16 ***
## ---

```

```

## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1735.735
## GAMLSS-RS iteration 2: Global Deviance = -1735.735
##
## Step:  AIC=-1633.73
## WINP ~ TEAM + PTS + FGP + `3PM` + `3PP` + FTM + FTA + FTP + OREB +
##       DREB + REB + TOV + STL + BLKA + PF + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PF
## trying - PFD
## trying - PlusMinus
##


|                | Df | AIC     | LRT    | Pr(Chi)       |
|----------------|----|---------|--------|---------------|
| ## - PF        | 1  | -1634.1 | 1.65   | 0.198387      |
| ## - `3PP`     | 1  | -1634.0 | 1.71   | 0.190943      |
| ## - BLKA      | 1  | -1633.8 | 1.99   | 0.158761      |
| ## <none>      |    | -1633.7 |        |               |
| ## - REB       | 1  | -1633.7 | 2.06   | 0.150810      |
| ## - OREB      | 1  | -1633.2 | 2.52   | 0.112697      |
| ## - DREB      | 1  | -1633.1 | 2.61   | 0.106040      |
| ## - `3PM`     | 1  | -1633.0 | 2.69   | 0.100724      |
| ## - PFD       | 1  | -1632.8 | 2.96   | 0.085365 .    |
| ## - TEAM      | 33 | -1632.8 | 66.99  | 0.000425 ***  |
| ## - FTP       | 1  | -1631.9 | 3.81   | 0.051031 .    |
| ## - FTA       | 1  | -1631.4 | 4.30   | 0.038206 *    |
| ## - FTM       | 1  | -1631.2 | 4.55   | 0.032920 *    |
| ## - TOV       | 1  | -1629.8 | 5.90   | 0.015111 *    |
| ## - PTS       | 1  | -1629.3 | 6.44   | 0.011132 *    |
| ## - STL       | 1  | -1628.1 | 7.60   | 0.005839 **   |
| ## - FGP       | 1  | -1626.8 | 8.97   | 0.002743 **   |
| ## - PlusMinus | 1  | -1241.4 | 394.32 | < 2.2e-16 *** |


## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1734.081
## GAMLSS-RS iteration 2: Global Deviance = -1734.081
##
## Step:  AIC=-1634.08
## WINP ~ TEAM + PTS + FGP + `3PM` + `3PP` + FTM + FTA + FTP + OREB +
##       DREB + REB + TOV + STL + BLKA + PFD + PlusMinus
##
## trying - TEAM

```

```

## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - `3PP`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - TOV
## trying - STL
## trying - BLKA
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT    Pr(Chi)
## - `3PP`      1 -1634.9    1.21 0.2713522
## - REB        1 -1634.2    1.87 0.1715264
## - BLKA       1 -1634.1    1.99 0.1587527
## <none>      -1634.1
## - PFD        1 -1633.8    2.32 0.1277033
## - OREB       1 -1633.7    2.35 0.1249765
## - DREB       1 -1633.6    2.45 0.1173303
## - FTP        1 -1632.4    3.71 0.0541210 .
## - `3PM`      1 -1632.3    3.74 0.0531352 .
## - FTA        1 -1631.8    4.24 0.0394254 *
## - FTM        1 -1631.5    4.53 0.0332125 *
## - TEAM      33 -1631.1   68.96 0.0002436 ***
## - STL        1 -1628.3    7.78 0.0052971 **
## - TOV        1 -1627.9    8.18 0.0042451 **
## - PTS        1 -1627.6    8.47 0.0036148 **
## - FGP        1 -1624.7   11.39 0.0007403 ***
## - PlusMinus  1 -1243.4  392.69 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1732.871
## GAMLSS-RS iteration 2: Global Deviance = -1732.871
##
## Step:  AIC=-1634.87
## WINP ~ TEAM + PTS + FGP + `3PM` + FTM + FTA + FTP + OREB + DREB +
##       REB + TOV + STL + BLKA + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - TOV
## trying - STL

```

```

## trying - BLKA
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT    Pr(Chi)
## - BLKA      1 -1635.1    1.78 0.1819234
## - REB       1 -1635.0    1.87 0.1709658
## <none>      -1634.9
## - PFD       1 -1634.6    2.30 0.1293834
## - OREB      1 -1634.5    2.34 0.1258541
## - DREB      1 -1634.4    2.43 0.1191025
## - TEAM     33 -1632.9   67.99 0.0003202 ***
## - FTP       1 -1632.6    4.27 0.0388713 *
## - FTA       1 -1632.0    4.91 0.0266493 *
## - `3PM`     1 -1632.0    4.92 0.0265300 *
## - FTM       1 -1631.6    5.24 0.0220878 *
## - STL       1 -1629.9    6.96 0.0083423 **
## - TOV       1 -1628.8    8.09 0.0044402 **
## - PTS       1 -1627.6    9.31 0.0022802 **
## - FGP       1 -1624.0   12.92 0.0003255 ***
## - PlusMinus 1 -1224.5  412.36 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1731.089
## GAMLSS-RS iteration 2: Global Deviance = -1731.089
##
## Step:  AIC=-1635.09
## WINP ~ TEAM + PTS + FGP + `3PM` + FTM + FTA + FTP + OREB + DREB +
##        REB + TOV + STL + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - REB
## trying - TOV
## trying - STL
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT    Pr(Chi)
## - REB       1 -1635.2    1.89 0.1688447
## <none>      -1635.1
## - TEAM     33 -1634.8   66.23 0.0005239 ***
## - OREB      1 -1634.7    2.35 0.1254629
## - DREB      1 -1634.7    2.44 0.1180605
## - PFD       1 -1634.5    2.58 0.1079932
## - FTP       1 -1632.9    4.21 0.0400840 *
## - FTA       1 -1632.2    4.88 0.0271393 *
## - FTM       1 -1631.9    5.17 0.0229430 *
## - `3PM`     1 -1630.7    6.37 0.0116287 *

```

```

## - STL          1 -1630.5    6.54 0.0105497 *
## - TOV          1 -1626.9   10.20 0.0014007 **
## - PTS          1 -1626.2   10.84 0.0009917 ***
## - FGP          1 -1622.0   15.08 0.0001032 ***
## - PlusMinus    1 -1217.4  419.69 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1729.196
## GAMLSS-RS iteration 2: Global Deviance = -1729.196
##
## Step:  AIC=-1635.2
## WINP ~ TEAM + PTS + FGP + `3PM` + FTM + FTA + FTP + OREB + DREB +
##      TOV + STL + PFD + PlusMinus
##
## trying - TEAM
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PFD
## trying - PlusMinus
##
##      Df      AIC      LRT    Pr(Chi)
## - TEAM      33 -1636.0   65.21 0.0006957 ***
## <none>      -1635.2
## - PFD        1 -1634.5    2.71 0.0996991 .
## - OREB        1 -1634.2    3.00 0.0830746 .
## - FTP         1 -1633.2    3.95 0.0469310 *
## - FTA         1 -1632.5    4.64 0.0312027 *
## - FTM         1 -1632.3    4.91 0.0266556 *
## - `3PM`       1 -1631.1    6.11 0.0134507 *
## - STL         1 -1630.9    6.34 0.0118281 *
## - DREB        1 -1628.3    8.91 0.0028340 **
## - TOV         1 -1627.3    9.93 0.0016289 **
## - PTS         1 -1626.6   10.61 0.0011232 **
## - FGP         1 -1622.3   14.85 0.0001161 ***
## - PlusMinus   1 -1219.1  418.14 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1663.991
## GAMLSS-RS iteration 2: Global Deviance = -1663.991
##
## Step:  AIC=-1635.99
## WINP ~ PTS + FGP + `3PM` + FTM + FTA + FTP + OREB + DREB + TOV +
##      STL + PFD + PlusMinus
##
## trying - PTS
## trying - FGP
## trying - `3PM`

```

```

## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PFD
## trying - PlusMinus
##           Df      AIC      LRT    Pr(Chi)
## - PFD         1 -1636.8    1.17 0.2790867
## - FTP         1 -1636.5    1.45 0.2286680
## - OREB         1 -1636.4    1.55 0.2130826
## - FTA         1 -1636.2    1.81 0.1780492
## <none>         -1636.0
## - FTM         1 -1635.9    2.06 0.1516657
## - STL         1 -1634.6    3.43 0.0639013 .
## - `3PM`       1 -1633.2    4.77 0.0289174 *
## - TOV         1 -1631.7    6.26 0.0123340 *
## - DREB         1 -1630.9    7.12 0.0076105 **
## - PTS         1 -1629.5    8.49 0.0035763 **
## - FGP         1 -1626.8   11.24 0.0008008 ***
## - PlusMinus   1 -1189.8 448.16 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1662.819
## GAMLSS-RS iteration 2: Global Deviance = -1662.819
##
## Step:  AIC=-1636.82
## WINP ~ PTS + FGP + `3PM` + FTM + FTA + FTP + OREB + DREB + TOV +
##       STL + PlusMinus
##
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - OREB
## trying - DREB
## trying - TOV
## trying - STL
## trying - PlusMinus
##           Df      AIC      LRT    Pr(Chi)
## - OREB         1 -1637.8    0.98 0.321162
## - FTP         1 -1637.7    1.13 0.287287
## - FTA         1 -1637.5    1.27 0.260050
## - FTM         1 -1637.2    1.60 0.205886
## <none>         -1636.8
## - STL         1 -1636.0    2.85 0.091378 .
## - `3PM`       1 -1634.8    3.98 0.046016 *
## - TOV         1 -1633.5    5.32 0.021051 *
## - DREB         1 -1632.6    6.18 0.012917 *
## - PTS         1 -1631.4    7.44 0.006395 **

```

```

## - FGP          1 -1628.7  10.08  0.001495 **
## - PlusMinus    1 -1161.6 477.20 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1661.835
## GAMLSS-RS iteration 2: Global Deviance = -1661.835
##
## Step:  AIC=-1637.83
## WINP ~ PTS + FGP + `3PM` + FTM + FTA + FTP + DREB + TOV + STL +
##      PlusMinus
##
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - FTA
## trying - FTP
## trying - DREB
## trying - TOV
## trying - STL
## trying - PlusMinus
##           Df      AIC      LRT   Pr(Chi)
## - FTA         1 -1638.66    1.17  0.279234
## - FTP         1 -1638.66    1.18  0.278205
## - FTM         1 -1638.44    1.40  0.236828
## - STL         1 -1637.96    1.88  0.170605
## <none>         -1637.83
## - `3PM`       1 -1636.05    3.78  0.051787 .
## - TOV         1 -1635.41    4.43  0.035406 *
## - DREB        1 -1633.81    6.03  0.014081 *
## - PTS         1 -1629.53   10.30  0.001327 **
## - FGP         1 -1622.94   16.90  3.95e-05 ***
## - PlusMinus   1  -905.38  734.45 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1660.664
## GAMLSS-RS iteration 2: Global Deviance = -1660.664
##
## Step:  AIC=-1638.66
## WINP ~ PTS + FGP + `3PM` + FTM + FTP + DREB + TOV + STL + PlusMinus
##
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - FTP
## trying - DREB
## trying - TOV
## trying - STL
## trying - PlusMinus
##           Df      AIC      LRT   Pr(Chi)
## - FTP         1 -1640.66    0.01  0.930028
## <none>         -1638.66
## - STL         1 -1638.66    2.00  0.156908

```



```

## - FTM          1 -1638.14    2.52  0.112385
## - `3PM`        1 -1637.16    3.51  0.061032 .
## - TOV          1 -1636.16    4.50  0.033882 *
## - DREB         1 -1634.83    5.84  0.015695 *
## - PTS          1 -1630.69    9.97  0.001587 **
## - FGP          1 -1624.32   16.34  5.28e-05 ***
## - PlusMinus    1  -907.33  733.33 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## GAMLSS-RS iteration 1: Global Deviance = -1660.657
## GAMLSS-RS iteration 2: Global Deviance = -1660.657
##
## Step:  AIC=-1640.66
## WINP ~ PTS + FGP + `3PM` + FTM + DREB + TOV + STL + PlusMinus
##
## trying - PTS
## trying - FGP
## trying - `3PM`
## trying - FTM
## trying - DREB
## trying - TOV
## trying - STL
## trying - PlusMinus
##           Df      AIC      LRT   Pr(Chi)
## <none>          -1640.66
## - STL           1 -1640.61    2.04  0.152896
## - FTM           1 -1640.11    2.54  0.110844
## - `3PM`         1 -1639.15    3.50  0.061257 .
## - TOV           1 -1637.95    4.70  0.030098 *
## - DREB          1 -1636.78    5.88  0.015345 *
## - PTS           1 -1632.59   10.06  0.001513 **
## - FGP           1 -1626.32   16.34  5.294e-05 ***
## - PlusMinus     1  -909.27  733.39 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Family:  c("NO", "Normal")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PTS + FGP + `3PM` + FTM + DREB +
##             TOV + STL + PlusMinus, family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)      PTS      FGP      `3PM`      FTM      DREB
##   0.226147  -0.003108   0.009672   0.003149   0.002312   0.003667
##      TOV      STL  PlusMinus
## -0.004373   0.003764   0.029249
## Sigma Coefficients:
## (Intercept)
##   -3.264
##
## Degrees of Freedom for the fit: 10 Residual Deg. of Freedom   440
## Global Deviance:      -1660.66

```

```

##          AIC:      -1640.66
##          SBC:      -1599.56

# Call:  gamlss(formula = WINP ~ PTS + FGP + PF + PlusMinus,      family = NO, data = dados_regressao)
#
# Mu Coefficients:
#   (Intercept)      PTS      FGP      PF      PlusMinus
# 0.4105976  -0.0006542   0.0048736  -0.0032414   0.0304204
# Sigma Coefficients:
#   (Intercept)
# -3.26
#
# Degrees of Freedom for the fit: 6 Residual Deg. of Freedom  444
# Global Deviance:      -1657.35
# AIC:      -1645.35
# SBC:      -1620.7

gamlss_normal_back <- gamlss(formula = WINP ~ PTS + FGP + PF + PlusMinus, family = NO, data = dados_reg

## GAMLSS-RS iteration 1: Global Deviance = -1657.353
## GAMLSS-RS iteration 2: Global Deviance = -1657.353

gamlss_normal_back

##
## Family:  c("NO", "Normal")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PTS + FGP + PF + PlusMinus,
##      family = NO, data = dados_regressao)
##
## Mu Coefficients:
##   (Intercept)      PTS      FGP      PF      PlusMinus
## 0.4105976  -0.0006542   0.0048736  -0.0032414   0.0304204
## Sigma Coefficients:
##   (Intercept)
## -3.26
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom  444
## Global Deviance:      -1657.35
##          AIC:      -1645.35
##          SBC:      -1620.7

coef(gamlss_normal_back)

##   (Intercept)      PTS      FGP      PF      PlusMinus
## 0.4105975914 -0.0006542452  0.0048736395 -0.0032414270  0.0304203770

summary(gamlss_normal_back) #AIC:      -1645.353

## *****
## Family:  c("NO", "Normal")
##
## Call:  gamlss(formula = WINP ~ PTS + FGP + PF + PlusMinus,
##      family = NO, data = dados_regressao)
##
## Fitting method: RS()

```

```

##
## -----
## Mu link function: identity
## Mu Coefficients:
##           Estimate Std. Error t value Pr(>|t|)
## (Intercept)  0.4105976  0.0711551   5.770 1.49e-08 ***
## PTS          -0.0006542  0.0003221  -2.031  0.04285 *
## FGP           0.0048736  0.0016875   2.888  0.00406 **
## PF           -0.0032414  0.0013059  -2.482  0.01343 *
## PlusMinus     0.0304204  0.0004963  61.289 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## Sigma link function: log
## Sigma Coefficients:
##           Estimate Std. Error t value Pr(>|t|)
## (Intercept) -3.26044   0.03333  -97.81 <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## -----
## No. of observations in the fit: 450
## Degrees of Freedom for the fit: 6
##      Residual Deg. of Freedom: 444
##                      at cycle: 2
##
## Global Deviance:      -1657.353
##           AIC:        -1645.353
##           SBC:        -1620.698
## *****
##### Análise ANOVA #####
##### Beta #####
modelo_gamlss1 #`3PP` + FTM + STL + PlusMinus

##
## Family: c("BE", "Beta")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ `3PP` + FTM + STL + PlusMinus,
##             family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)      `3PP`           FTM           STL      PlusMinus
## -0.2405400   0.0081551  -0.0029726  -0.0004249   0.1341058
## Sigma Coefficients:
## (Intercept)
##      -2.444
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom 444
## Global Deviance:      -1664.53
##           AIC:        -1652.53
##           SBC:        -1627.87

```

```
gamlss_beta_back #WINP ~ PTS + FGA + FGP + `3PA` + `3PP`+FTM + PF + PlusMinus
```

```
##
## Family: c("BE", "Beta")
## Fitting method: RS()
##
## Call: gamlss(formula = WINP ~ PTS + FGA + FGP + `3PA` + `3PP` +
## FTM + PF + PlusMinus, family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)      PTS      FGA      FGP      `3PA`      `3PP`
##   -7.32808   -0.08135    0.07156    0.15412    0.02814    0.02426
##      FTM      PF    PlusMinus
##    0.07866   -0.01374    0.13087
## Sigma Coefficients:
## (Intercept)
##    -2.466
##
## Degrees of Freedom for the fit: 10 Residual Deg. of Freedom    440
## Global Deviance:      -1682.93
##           AIC:      -1662.93
##           SBC:      -1621.84
```

```
gamlss_beta_forw #PlusMinus + FGP + PTS + PF, deu significativo
```

```
##
## Family: c("BE", "Beta")
## Fitting method: RS()
##
## Call: gamlss(formula = WINP ~ PlusMinus + FGP + PTS + PF,
## family = BE, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)  PlusMinus      FGP      PTS      PF
##   -0.505065    0.131669    0.023267   -0.003065   -0.012155
## Sigma Coefficients:
## (Intercept)
##    -2.458
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
## Global Deviance:      -1676.84
##           AIC:      -1664.84
##           SBC:      -1640.19
```

```
modelo_beta0 <- gamlss(WINP ~ 1, data = dados_regressao, family = BE)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -440.3197
## GAMLSS-RS iteration 2: Global Deviance = -440.3212
## GAMLSS-RS iteration 3: Global Deviance = -440.3212
```

```
modelo_beta_plus <- gamlss(WINP ~ PlusMinus, data = dados_regressao, family = BE)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1315.679
## GAMLSS-RS iteration 2: Global Deviance = -1660.864
## GAMLSS-RS iteration 3: Global Deviance = -1661.349
## GAMLSS-RS iteration 4: Global Deviance = -1661.349
```

```

modelo_beta_fgp <- gamlss(WINP ~ PlusMinus + FGP, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1317.833
## GAMLSS-RS iteration 2: Global Deviance = -1666.409
## GAMLSS-RS iteration 3: Global Deviance = -1666.902
## GAMLSS-RS iteration 4: Global Deviance = -1666.902

modelo_beta_pts <- gamlss(WINP ~ PlusMinus + FGP + PTS, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1319.722
## GAMLSS-RS iteration 2: Global Deviance = -1671.714
## GAMLSS-RS iteration 3: Global Deviance = -1672.217
## GAMLSS-RS iteration 4: Global Deviance = -1672.217

modelo_beta_pf <- gamlss(WINP ~ PlusMinus + FGP + PTS + PF, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1321.858
## GAMLSS-RS iteration 2: Global Deviance = -1676.336
## GAMLSS-RS iteration 3: Global Deviance = -1676.843
## GAMLSS-RS iteration 4: Global Deviance = -1676.843

modelo_beta_pf_ftm <- gamlss(WINP ~ PlusMinus + FGP + PTS + PF + FTM, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1321.858
## GAMLSS-RS iteration 2: Global Deviance = -1676.336
## GAMLSS-RS iteration 3: Global Deviance = -1676.843
## GAMLSS-RS iteration 4: Global Deviance = -1676.843

modelo_beta_pf_3pp <- gamlss(WINP ~ PlusMinus + FGP + PTS + PF + `3PP`, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1322.292
## GAMLSS-RS iteration 2: Global Deviance = -1677.531
## GAMLSS-RS iteration 3: Global Deviance = -1678.04
## GAMLSS-RS iteration 4: Global Deviance = -1678.04

modelo_beta_pf_3pa <- gamlss(WINP ~ PlusMinus + FGP + PTS + PF + `3PA`, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1322.014
## GAMLSS-RS iteration 2: Global Deviance = -1676.595
## GAMLSS-RS iteration 3: Global Deviance = -1677.101
## GAMLSS-RS iteration 4: Global Deviance = -1677.101

modelo_beta_pf_fga <- gamlss(WINP ~ PlusMinus + FGP + PTS + PF + FGA, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1321.949
## GAMLSS-RS iteration 2: Global Deviance = -1676.469
## GAMLSS-RS iteration 3: Global Deviance = -1676.975
## GAMLSS-RS iteration 4: Global Deviance = -1676.975

modelo_beta_stl <- gamlss(WINP ~ PlusMinus + STL, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1315.706
## GAMLSS-RS iteration 2: Global Deviance = -1660.975
## GAMLSS-RS iteration 3: Global Deviance = -1661.46
## GAMLSS-RS iteration 4: Global Deviance = -1661.46

modelo_beta_3pp <- gamlss(WINP ~ PlusMinus + `3PP`, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1316.735

```

```

## GAMLSS-RS iteration 2: Global Deviance = -1663.605
## GAMLSS-RS iteration 3: Global Deviance = -1664.094
## GAMLSS-RS iteration 4: Global Deviance = -1664.094

modelo_beta_ftm <- gamlss(WINP ~ PlusMinus + `3PP` + FTM, data = dados_regressao, family = BE)

## GAMLSS-RS iteration 1: Global Deviance = -1316.912
## GAMLSS-RS iteration 2: Global Deviance = -1664.034
## GAMLSS-RS iteration 3: Global Deviance = -1664.524
## GAMLSS-RS iteration 4: Global Deviance = -1664.524

lrtest(modelo_beta0, modelo_beta_plus) #2.2e-16 plusMinus deu significativo

## Likelihood ratio test
##
## Model 1: WINP ~ 1
## Model 2: WINP ~ PlusMinus
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1     2 220.16
## 2     3 830.67  1  1221  < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_beta_plus, modelo_beta_fgp) #0.01844, FGP significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus
## Model 2: WINP ~ PlusMinus + FGP
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1     3 830.67
## 2     4 833.45  1  5.5537    0.01844 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_beta_fgp, modelo_beta_pts) #0.02115, PTS significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + FGP
## Model 2: WINP ~ PlusMinus + FGP + PTS
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1     4 833.45
## 2     5 836.11  1  5.3144    0.02115 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_beta_pts, modelo_beta_pf) #0.03149, PF significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + FGP + PTS
## Model 2: WINP ~ PlusMinus + FGP + PTS + PF
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1     5 836.11
## 2     6 838.42  1  4.6262    0.03149 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

```

```
lrtest(modelo_beta_pf, modelo_beta_pf_ftm)#0.9896, FTM não significativo
```

```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + FGP + PTS + PF
## Model 2: WINP ~ PlusMinus + FGP + PTS + PF + FTM
##   #Df LogLik Df Chisq Pr(>Chisq)
## 1    6 838.42
## 2    7 838.42  1 2e-04    0.9896
```

```
lrtest(modelo_beta_pf, modelo_beta_pf_3pp)#0.274, 3pp não significativo
```

```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + FGP + PTS + PF
## Model 2: WINP ~ PlusMinus + FGP + PTS + PF + `3PP`
##   #Df LogLik Df Chisq Pr(>Chisq)
## 1    6 838.42
## 2    7 839.02  1 1.1966    0.274
```

```
lrtest(modelo_beta_pf, modelo_beta_pf_3pa)#0.6111, 3pa não significativo
```

```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + FGP + PTS + PF
## Model 2: WINP ~ PlusMinus + FGP + PTS + PF + `3PA`
##   #Df LogLik Df Chisq Pr(>Chisq)
## 1    6 838.42
## 2    7 838.55  1 0.2585    0.6111
```

```
lrtest(modelo_beta_pf, modelo_beta_pf_fga)#0.716, FGA não significativo
```

```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + FGP + PTS + PF
## Model 2: WINP ~ PlusMinus + FGP + PTS + PF + FGA
##   #Df LogLik Df Chisq Pr(>Chisq)
## 1    6 838.42
## 2    7 838.49  1 0.1324    0.716
```

```
lrtest(modelo_beta_plus, modelo_beta_stl) #0.7386 STL deu não significativo
```

```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus
## Model 2: WINP ~ PlusMinus + STL
##   #Df LogLik Df Chisq Pr(>Chisq)
## 1    3 830.67
## 2    4 830.73  1 0.1114    0.7386
```

```
lrtest(modelo_beta_plus, modelo_beta_3pp) #0.09752 3PP deu significativo
```

```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus
## Model 2: WINP ~ PlusMinus + `3PP`
##   #Df LogLik Df Chisq Pr(>Chisq)
```

```

## 1 3 830.67
## 2 4 832.05 1 2.7456 0.09752 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_beta_3pp, modelo_beta_ftm) #0.5123 FTM deu não significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + `3PP`
## Model 2: WINP ~ PlusMinus + `3PP` + FTM
## #Df LogLik Df Chisq Pr(>Chisq)
## 1 4 832.05
## 2 5 832.26 1 0.4294 0.5123

#gamlss_beta_forw foi o melhor modelo analisado

##### Normal #####
modelo_gamlssN1 #TOV + STL + PF + PlusMinus

##
## Family: c("NO", "Normal")
## Fitting method: RS()
##
## Call: gamlss(formula = WINP ~ TOV + STL + PF + PlusMinus,
## family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept) TOV STL PF PlusMinus
## 5.650e-01 -4.755e-05 5.647e-04 -3.392e-03 3.107e-02
## Sigma Coefficients:
## (Intercept)
## -3.251
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom 444
## Global Deviance: -1648.78
## AIC: -1636.78
## SBC: -1612.12

gamlss_normal_back #PTS + FGP + PF + PlusMinus

##
## Family: c("NO", "Normal")
## Fitting method: RS()
##
## Call: gamlss(formula = WINP ~ PTS + FGP + PF + PlusMinus,
## family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept) PTS FGP PF PlusMinus
## 0.4105976 -0.0006542 0.0048736 -0.0032414 0.0304204
## Sigma Coefficients:
## (Intercept)
## -3.26
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom 444

```



```
## Global Deviance:      -1657.35
##           AIC:        -1645.35
##           SBC:        -1620.7
```

```
gamlss_normal_forw #PlusMinus + PF + FGP + FGM
```

```
##
## Family:  c("NO", "Normal")
## Fitting method: RS()
##
## Call:  gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM,
##             family = NO, data = dados_regressao)
##
## Mu Coefficients:
## (Intercept)      PlusMinus          PF          FGP          FGM
##    0.401565    0.030261   -0.003478    0.005746   -0.002433
## Sigma Coefficients:
## (Intercept)
##    -3.262
##
## Degrees of Freedom for the fit: 6 Residual Deg. of Freedom    444
## Global Deviance:      -1658.44
##           AIC:        -1646.44
##           SBC:        -1621.78
```

```
modelo_normal0 <- gamlss(formula = WINP ~1, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -427.5666
## GAMLSS-RS iteration 2: Global Deviance = -427.5666
```

```
modelo_normal_plusMinus <- gamlss(formula = WINP ~ PlusMinus, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1642.391
## GAMLSS-RS iteration 2: Global Deviance = -1642.391
```

```
modelo_normal_pf <- gamlss(formula = WINP ~ PlusMinus + PF, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1648.718
## GAMLSS-RS iteration 2: Global Deviance = -1648.718
```

```
modelo_normal_fgp <- gamlss(formula = WINP ~ PlusMinus + PF + FGP, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1653.247
## GAMLSS-RS iteration 2: Global Deviance = -1653.247
```

```
modelo_normal_stl <- gamlss(formula = WINP ~ PlusMinus + PF + FGP + STL, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1653.306
## GAMLSS-RS iteration 2: Global Deviance = -1653.306
```

```
modelo_normal_tov <- gamlss(formula = WINP ~ PlusMinus + PF + FGP + TOV, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1653.3
## GAMLSS-RS iteration 2: Global Deviance = -1653.3
```

```
modelo_normal_fgm <- gamlss(formula = WINP ~ PlusMinus + PF + FGP + FGM, family = NO, data = dados_regressao)
```

```
## GAMLSS-RS iteration 1: Global Deviance = -1658.44
## GAMLSS-RS iteration 2: Global Deviance = -1658.44
```

```

modelo_normal_pts <- gamlss(formula = WINP ~ PlusMinus + PF + FGP + PTS, family = NO, data = dados_regr

## GAMLSS-RS iteration 1: Global Deviance = -1657.353
## GAMLSS-RS iteration 2: Global Deviance = -1657.353

modelo_normal_ptsfgm <- gamlss(formula = WINP ~ PlusMinus + PF + FGP + PTS + FGM, family = NO, data = d

## GAMLSS-RS iteration 1: Global Deviance = -1658.444
## GAMLSS-RS iteration 2: Global Deviance = -1658.444

lrtest(modelo_normal0, modelo_normal_plusMinus) #2.2e-16, plusminus deu significativo

## Likelihood ratio test
##
## Model 1: WINP ~ 1
## Model 2: WINP ~ PlusMinus
##   #Df LogLik Df   Chisq Pr(>Chisq)
## 1    2 213.78
## 2    3 821.20  1 1214.8  < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_normal_plusMinus, modelo_normal_pf) #0.01189, PF deu significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus
## Model 2: WINP ~ PlusMinus + PF
##   #Df LogLik Df   Chisq Pr(>Chisq)
## 1    3 821.20
## 2    4 824.36  1  6.3266    0.01189 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_normal_pf, modelo_normal_fgp) #0.03331, FGP deu significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + PF
## Model 2: WINP ~ PlusMinus + PF + FGP
##   #Df LogLik Df   Chisq Pr(>Chisq)
## 1    4 824.36
## 2    5 826.62  1  4.5296    0.03331 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

lrtest(modelo_normal_fgp, modelo_normal_stl) #0.8083, STL deu não significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + PF + FGP
## Model 2: WINP ~ PlusMinus + PF + FGP + STL
##   #Df LogLik Df   Chisq Pr(>Chisq)
## 1    5 826.62
## 2    6 826.65  1  0.0589    0.8083

lrtest(modelo_normal_fgp, modelo_normal_tov) #0.8184, TOV deu não significativo

```

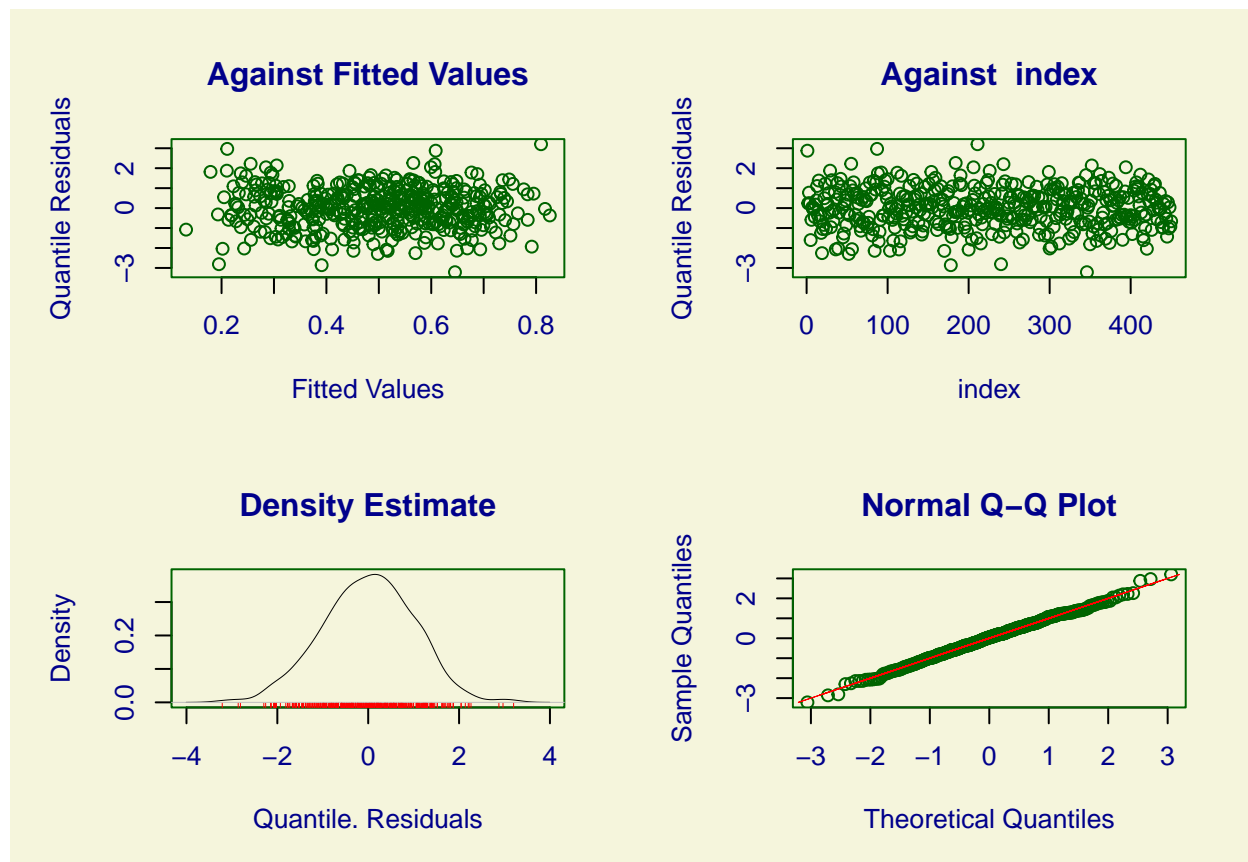
```
## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + PF + FGP
## Model 2: WINP ~ PlusMinus + PF + FGP + TOV
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1    5 826.62
## 2    6 826.65  1 0.0527    0.8184
lrtest(modelo_normal_fgp, modelo_normal_fgm) #0.02268, FGM deu significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + PF + FGP
## Model 2: WINP ~ PlusMinus + PF + FGP + FGM
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1    5 826.62
## 2    6 829.22  1 5.1928    0.02268 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
lrtest(modelo_normal_fgp, modelo_normal_pts) #0.04273, PTS deu significativo

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + PF + FGP
## Model 2: WINP ~ PlusMinus + PF + FGP + PTS
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1    5 826.62
## 2    6 828.68  1 4.106    0.04273 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
lrtest(modelo_normal_pts, modelo_normal_ptsfgm) #0.2963, PTS e FGM juntos não deram significativos

## Likelihood ratio test
##
## Model 1: WINP ~ PlusMinus + PF + FGP + PTS
## Model 2: WINP ~ PlusMinus + PF + FGP + PTS + FGM
##   #Df LogLik Df  Chisq Pr(>Chisq)
## 1    6 828.68
## 2    7 829.22  1 1.0906    0.2963
#Melhores modelos são backward e forward.

##### Análise de Resíduos #####
##### Beta #####
##### Modelo Completo #####
plot(modelo_gamlss)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = 0.001942134
##              variance = 1.002264
##              coef. of skewness = -0.08444201
##              coef. of kurtosis = 3.07018
## Filliben correlation coefficient = 0.9987175
## *****
```

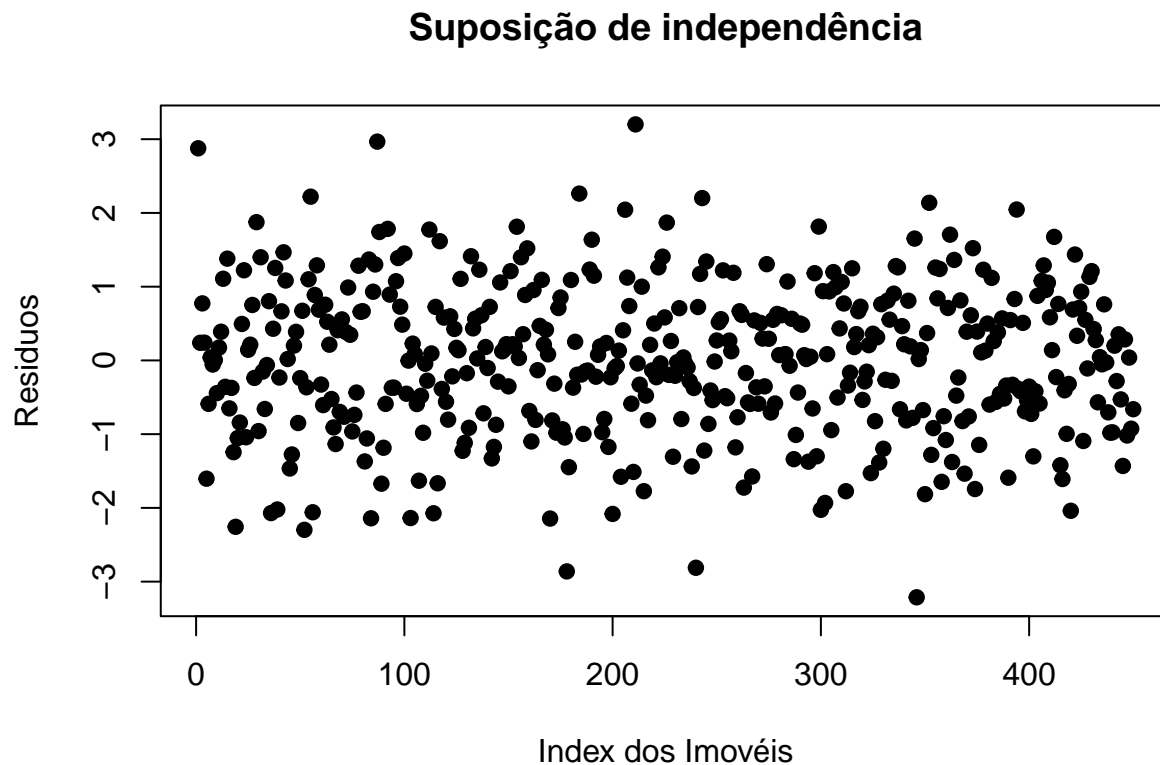
```
shapiro.test(modelo_gamlss$residuals) #p-value = 0.2651, normal
```

```
##
##  Shapiro-Wilk normality test
##
## data:  modelo_gamlss$residuals
## W = 0.99755, p-value = 0.7539
```

```
#Teste de durbin watson para independencia
library(lmtest)
dwtest(modelo_gamlss) #p-value = 0.2282
```

```
##
##  Durbin-Watson test
##
## data:  modelo_gamlss
## DW = 1.9425, p-value = 0.09558
## alternative hypothesis: true autocorrelation is greater than 0
```

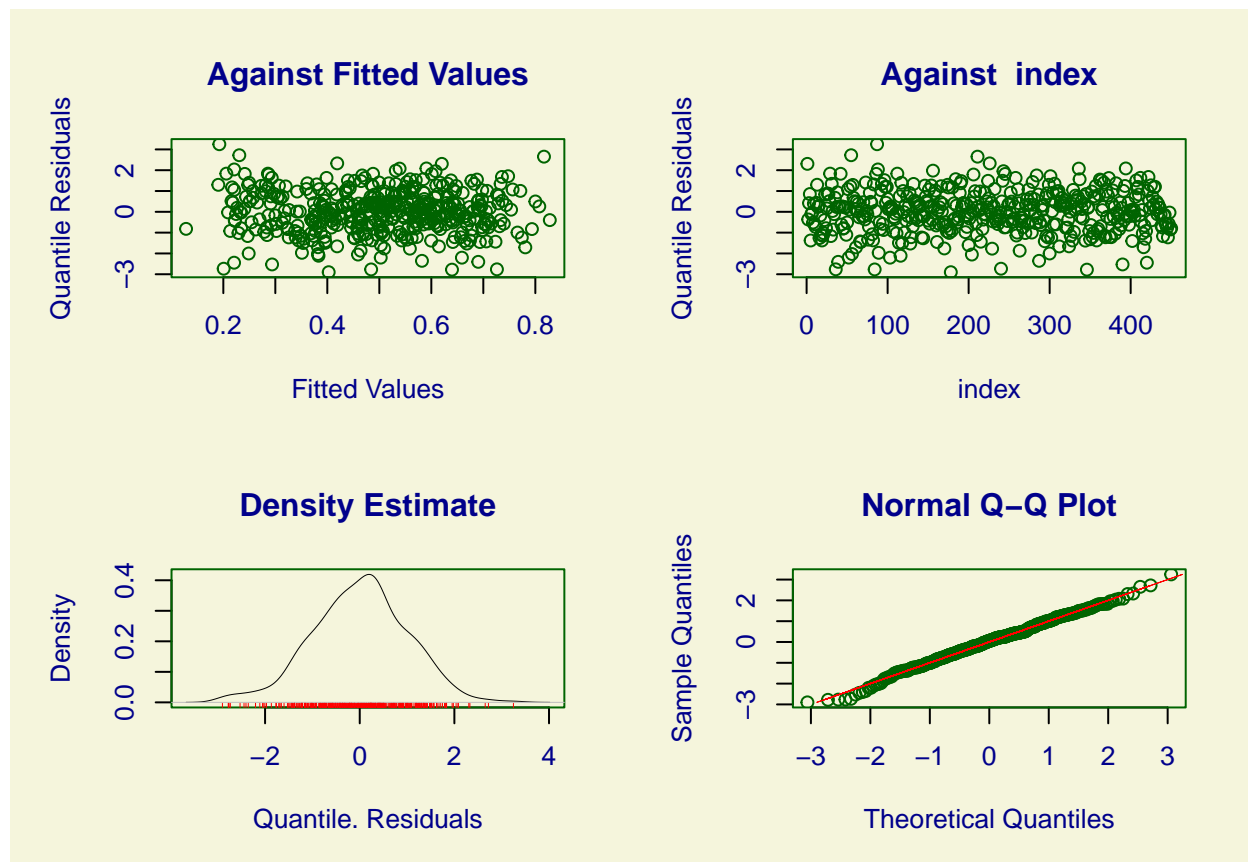
```
#Independência
plot(modelo_gamlss$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```



```
#Breusch_Pagan para homocedasticidade
bptest(modelo_gamlss) #p-value = 0.04578
```

```
##
## studentized Breusch-Pagan test
##
## data: modelo_gamlss
## BP = 67.811, df = 68, p-value = 0.4837
```

```
##### Modelo 10% #####
plot(modelo_gamlss1)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = 0.003646082
##              variance = 1.002494
##              coef. of skewness = -0.1241129
##              coef. of kurtosis = 3.16992
## Filliben correlation coefficient = 0.9981985
## *****
```

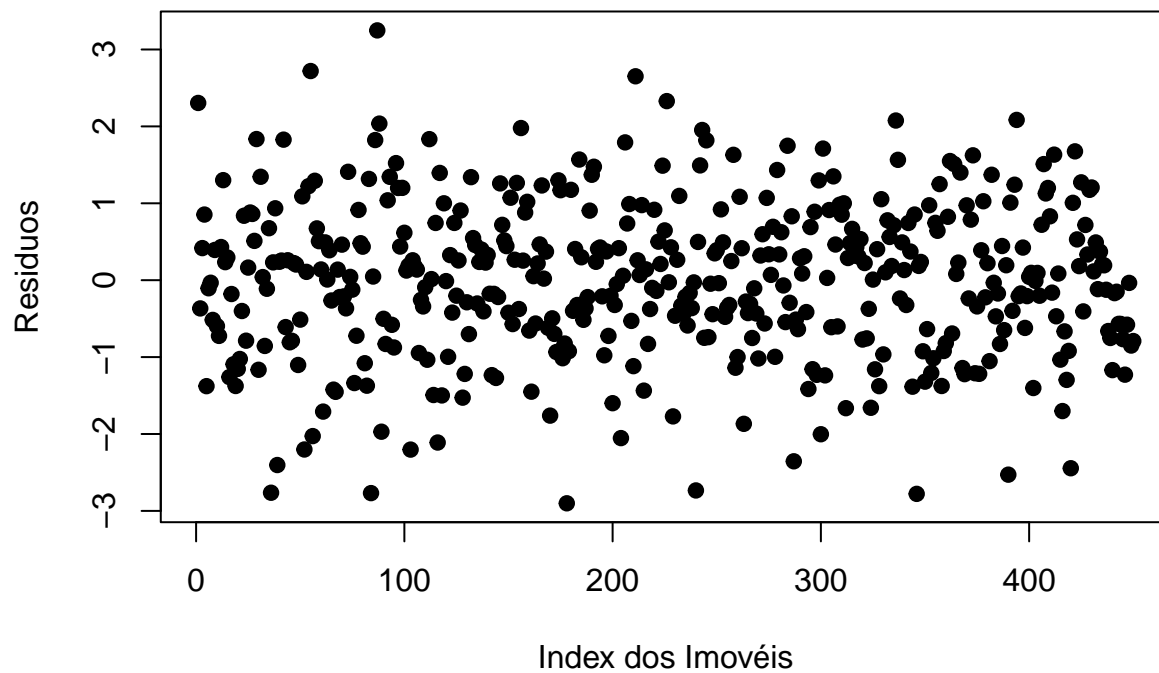
```
shapiro.test(modelo_gamlss1$residuals) #p-value = 0.3737, normal
```

```
##
##  Shapiro-Wilk normality test
##
## data:  modelo_gamlss1$residuals
## W = 0.99625, p-value = 0.3718
##
## Teste de durbin watson para independencia
library(lmtest)
dwtest(modelo_gamlss1) #p-value = 0.2548
```

```
##
##  Durbin-Watson test
##
## data:  modelo_gamlss1
## DW = 1.9425, p-value = 0.2544
## alternative hypothesis: true autocorrelation is greater than 0
```

```
#Independência
plot(modelo_gamlss1$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

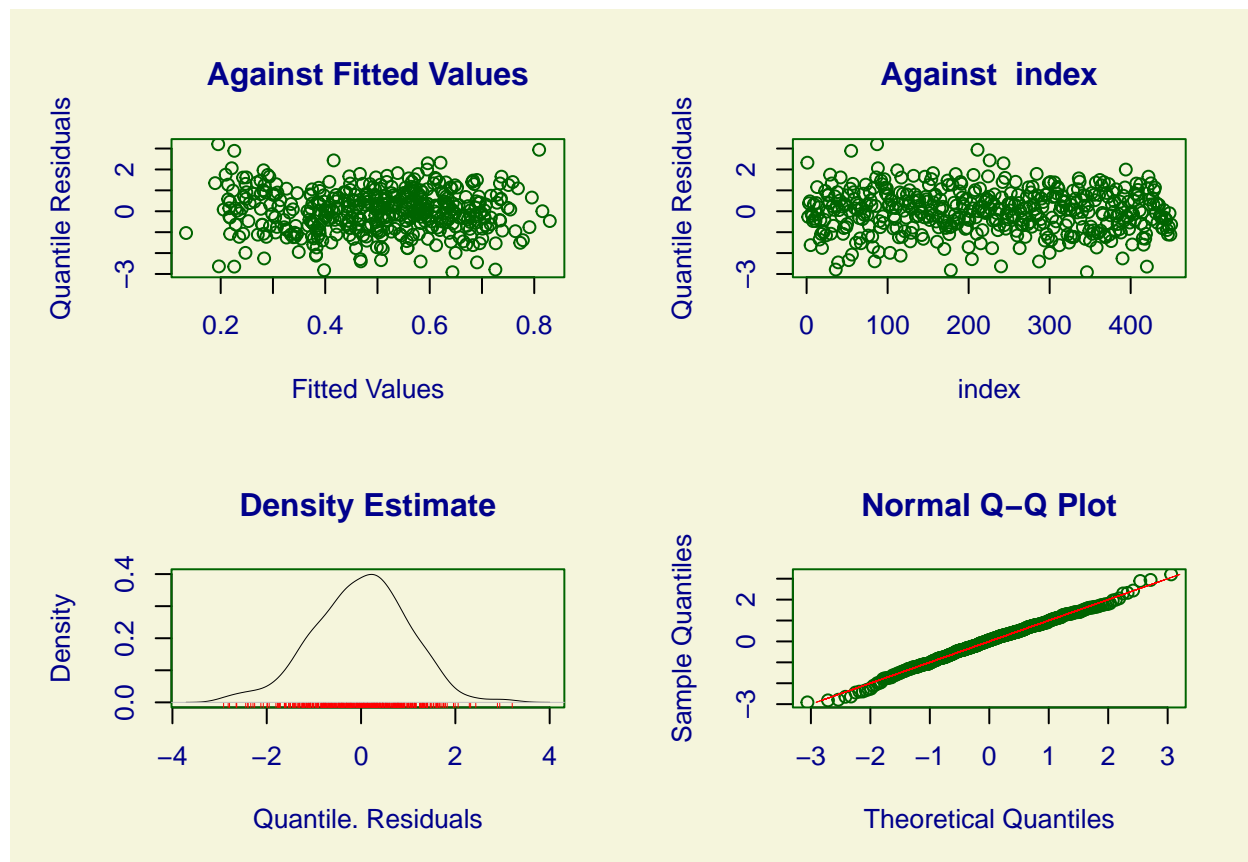
## Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(modelo_gamlss1) #p-value = 0.09055 , homocedastico
```

```
##
## studentized Breusch-Pagan test
##
## data: modelo_gamlss1
## BP = 6.532, df = 4, p-value = 0.1628
```

```
##### Forward #####
plot(gamlss_beta_forw)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = 0.003493076
##              variance = 1.002508
##              coef. of skewness = -0.1366816
##              coef. of kurtosis = 3.200036
## Filliben correlation coefficient = 0.9980074
## *****
```

```
shapiro.test(gamlss_beta_forw$residuals) #p-value = 0.2853, normal
```

```
##
##  Shapiro-Wilk normality test
##
## data:  gamlss_beta_forw$residuals
## W = 0.99586, p-value = 0.2853
```

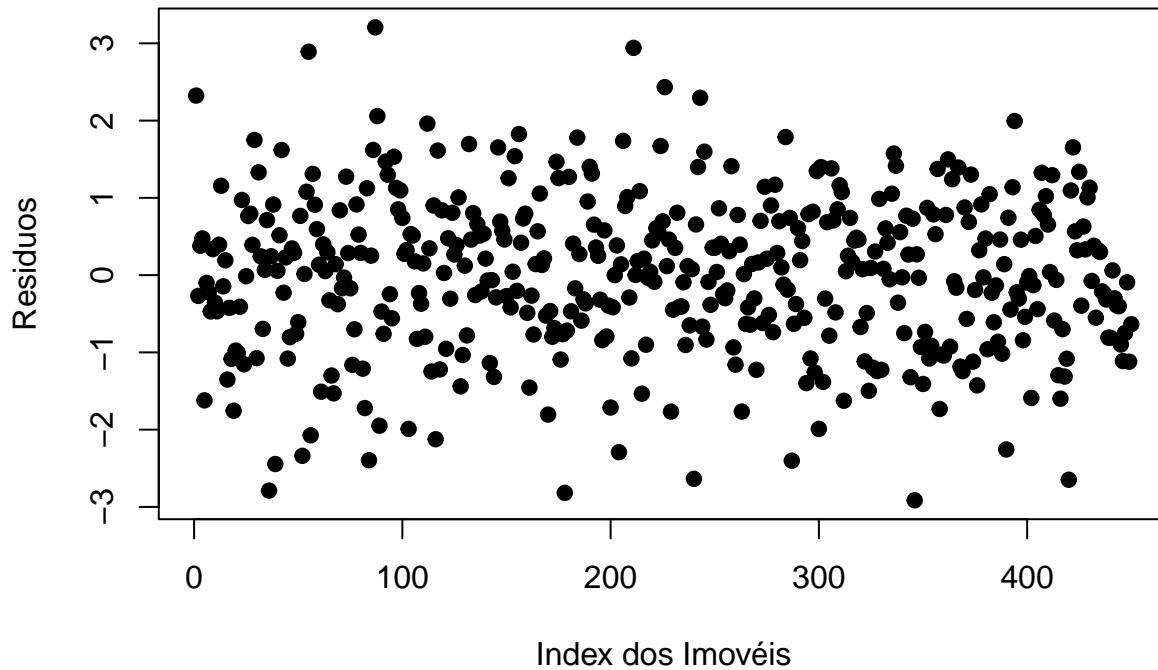
```
#Teste de durbin watson para independencia
library(lmtest)
dwtest(gamlss_beta_forw) #p-value = 0.1735
```

```
##
##  Durbin-Watson test
##
## data:  gamlss_beta_forw
## DW = 1.9193, p-value = 0.1735
## alternative hypothesis: true autocorrelation is greater than 0
```



```
#Independência
plot(gamlss_beta_forw$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

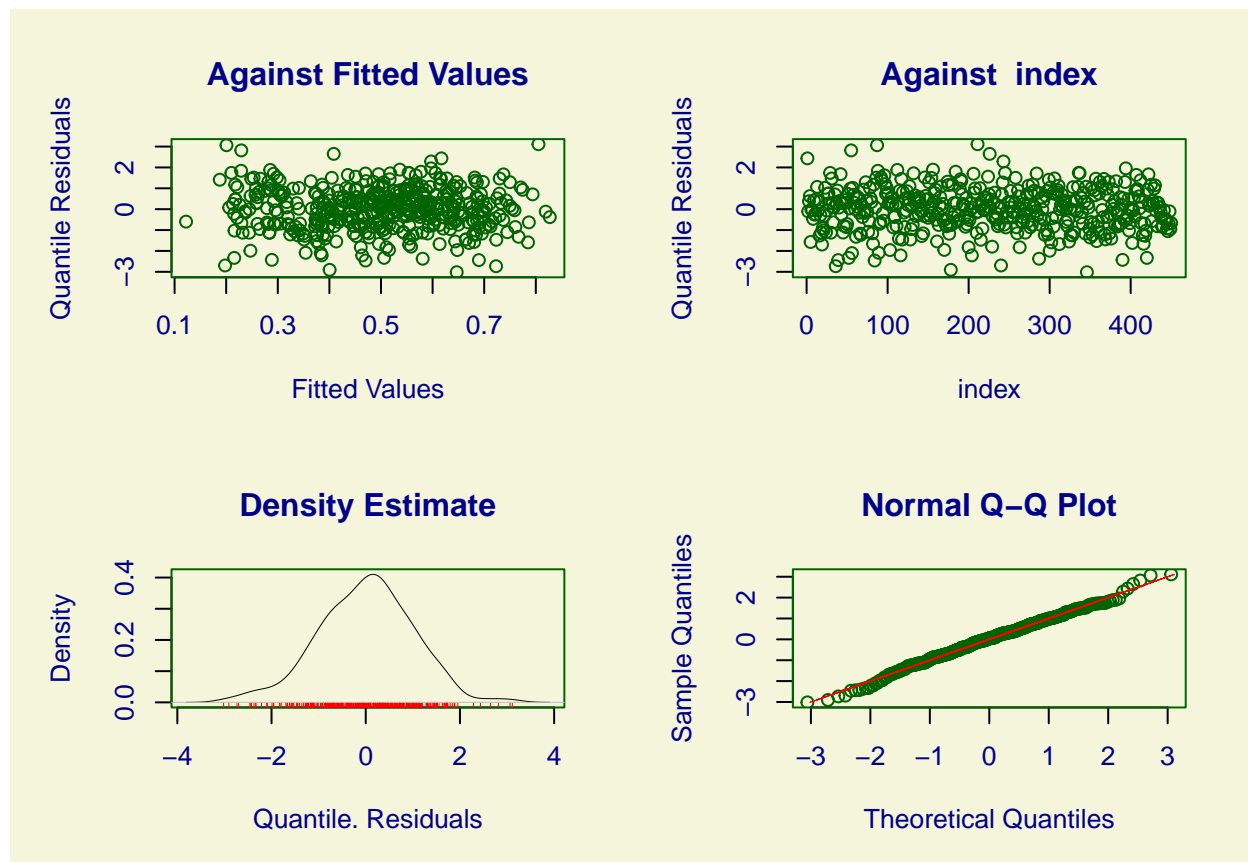
### Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(gamlss_beta_forw) #p-value = 0.0006407
```

```
##
## studentized Breusch-Pagan test
##
## data: gamlss_beta_forw
## BP = 19.451, df = 4, p-value = 0.0006407
```

```
##### Backward #####
plot(gamlss_beta_back)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = 0.002461363
##              variance = 1.002478
##              coef. of skewness = -0.127312
##              coef. of kurtosis = 3.257866
## Filliben correlation coefficient = 0.9978309
## *****
```

```
shapiro.test(gamlss_beta_back$residuals) #p-value = 0.2253, normal
```

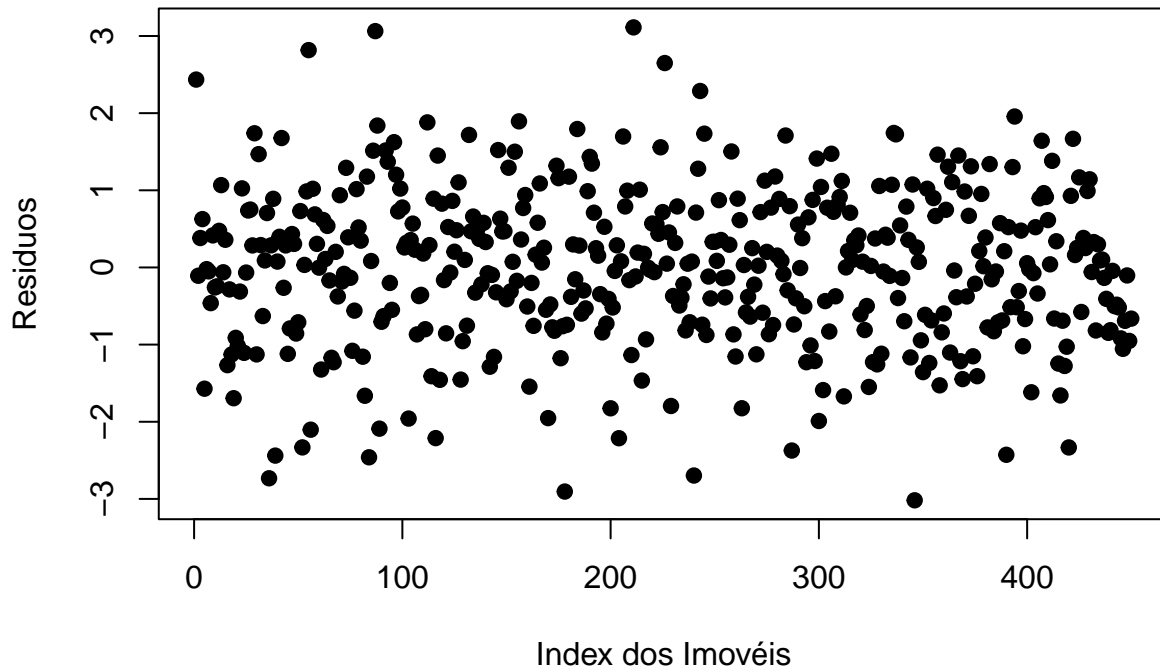
```
##
##  Shapiro-Wilk normality test
##
## data:  gamlss_beta_back$residuals
## W = 0.99552, p-value = 0.2253
```

```
#Teste de durbin watson para independencia
library(lmtest)
dwtest(gamlss_beta_back) #p-value = 0.2641
```

```
##
##  Durbin-Watson test
##
## data:  gamlss_beta_back
## DW = 1.951, p-value = 0.2641
## alternative hypothesis: true autocorrelation is greater than 0
```

```
#Independência
plot(gamlss_beta_back$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

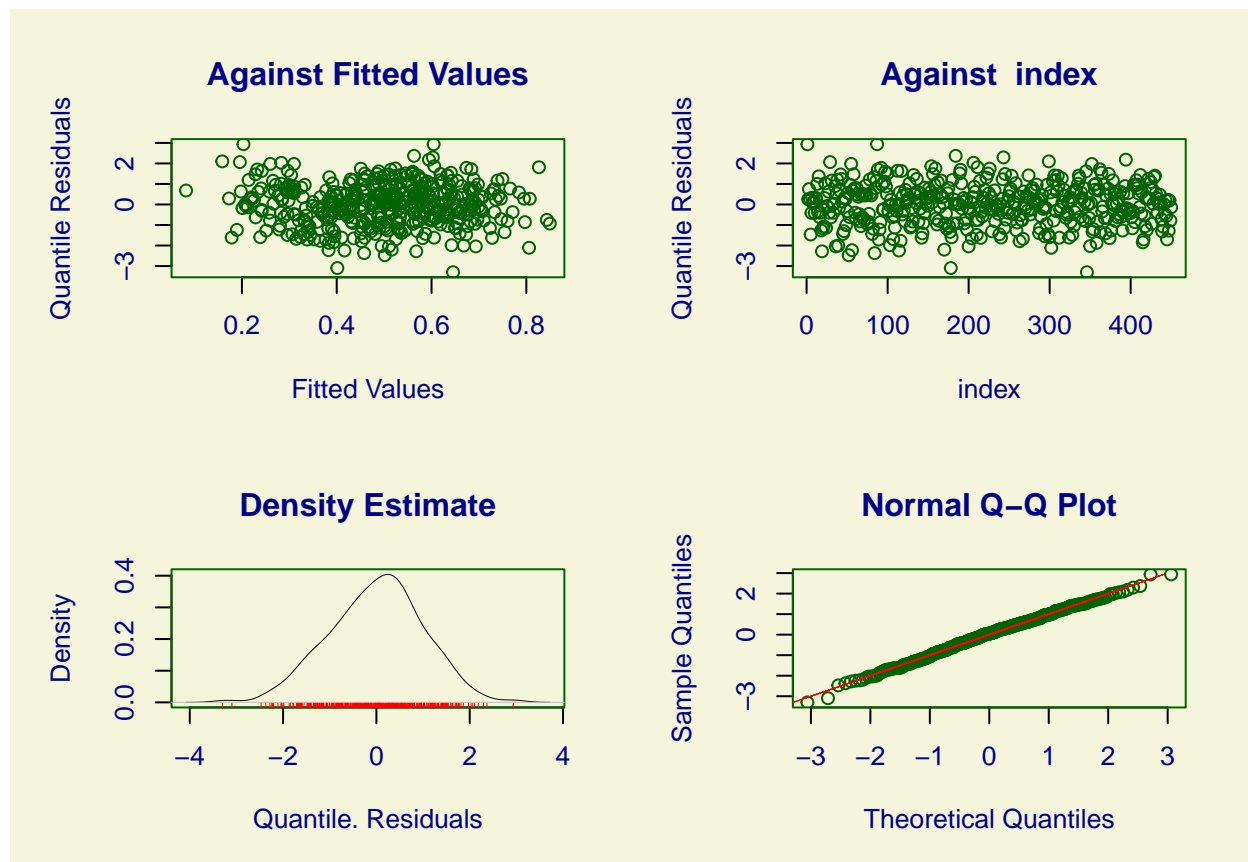
### Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(gamlss_beta_back) #p-value = 0.01486
```

```
##
## studentized Breusch-Pagan test
##
## data: gamlss_beta_back
## BP = 19.001, df = 8, p-value = 0.01486
```

```
##### Normal #####
##### Modelo Completo #####
plot(modelo_gamlssN)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = -9.509516e-17
##              variance = 1.002227
##              coef. of skewness = -0.1485356
##              coef. of kurtosis = 2.987305
## Filliben correlation coefficient = 0.9985421
## *****
```

```
shapiro.test(modelo_gamlssN$residuals) #p-value = 0.1997, normal
```

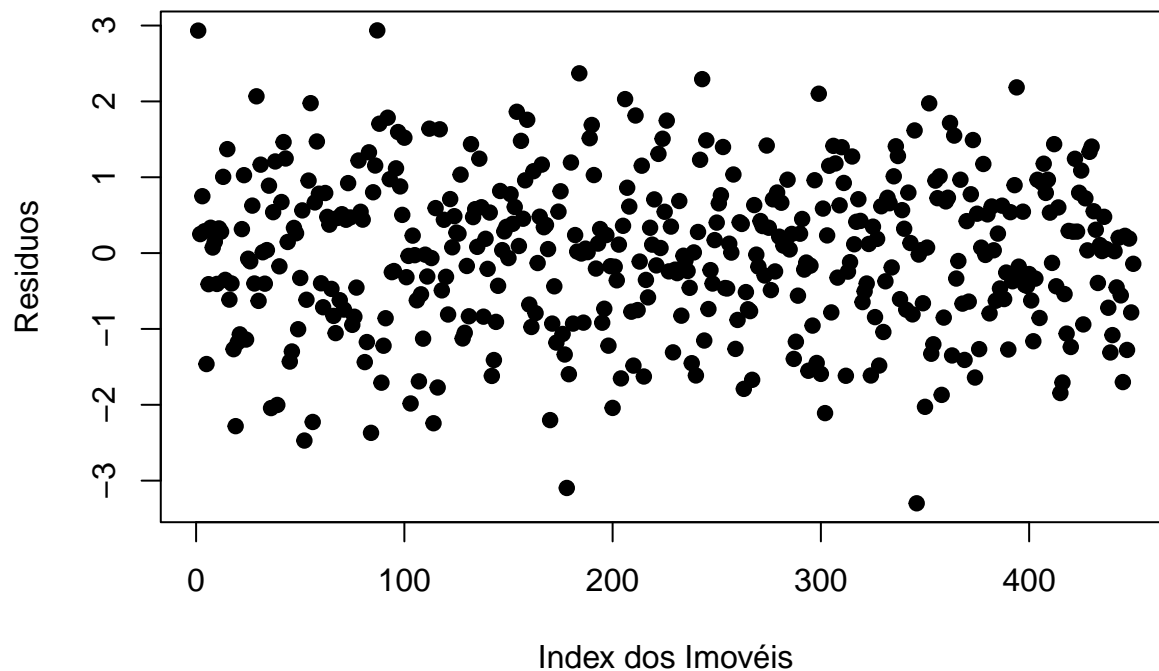
```
##
##  Shapiro-Wilk normality test
##
## data:  modelo_gamlssN$residuals
## W = 0.99713, p-value = 0.6228
```

```
#Teste de durbin watson para independencia
library(lmtest)
dwtest(modelo_gamlssN) #p-value = 0.2282
```

```
##
##  Durbin-Watson test
##
## data:  modelo_gamlssN
## DW = 1.9425, p-value = 0.09558
## alternative hypothesis: true autocorrelation is greater than 0
```

```
#Independência
plot(modelo_gamlssN$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

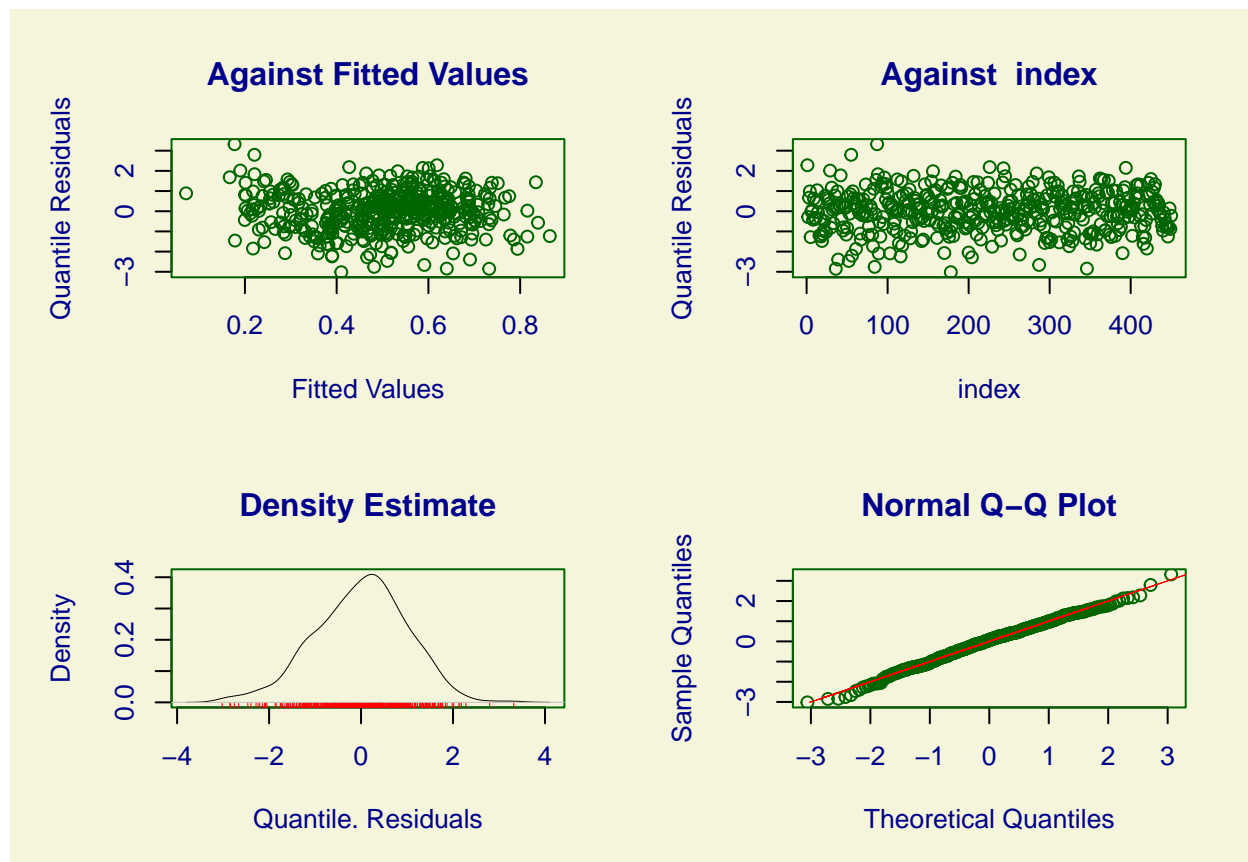
## Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(modelo_gamlssN) #p-value = 0.04578
```

```
##
## studentized Breusch-Pagan test
##
## data: modelo_gamlssN
## BP = 67.811, df = 68, p-value = 0.4837
```

```
##### Modelo Normal 10% #####
plot(modelo_gamlssN1)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = -2.990907e-16
##              variance = 1.002227
##              coef. of skewness = -0.2039986
##              coef. of kurtosis = 3.10844
## Filliben correlation coefficient = 0.9975946
## *****
```

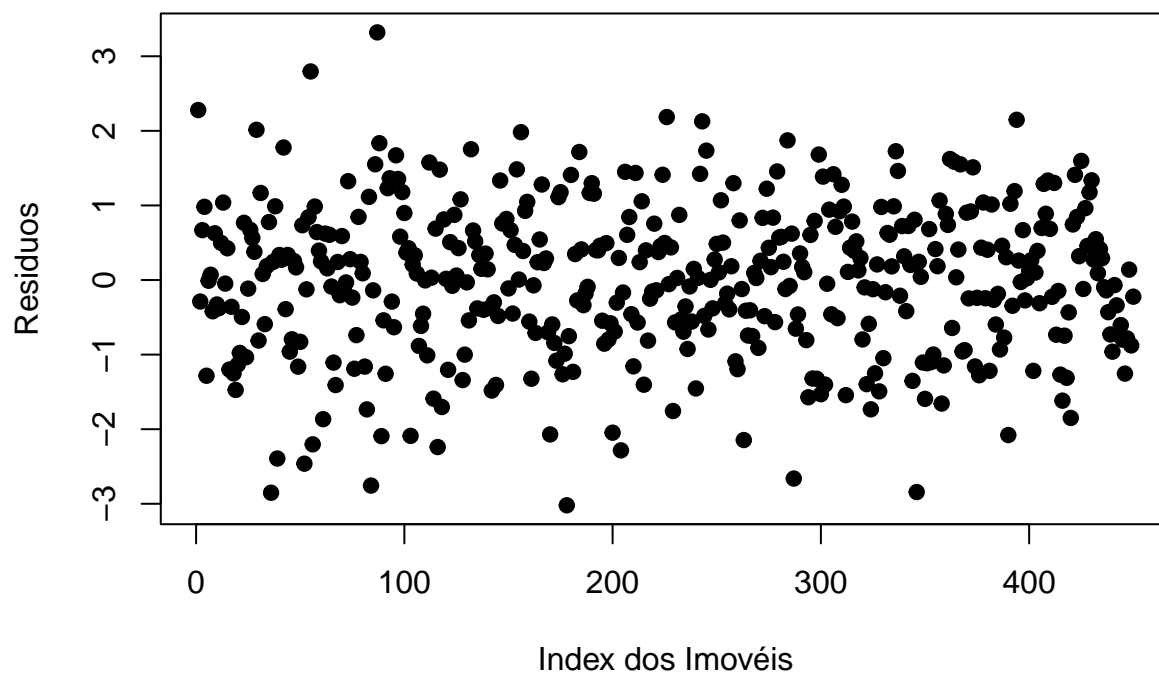
```
shapiro.test(modelo_gamlssN1$residuals) #p-value = 0.1847, normal
```

```
##
##  Shapiro-Wilk normality test
##
## data:  modelo_gamlssN1$residuals
## W = 0.99524, p-value = 0.1846
##
## Teste de durbin watson para independencia
library(lmtest)
dwtest(modelo_gamlssN1) #p-value = 0.2497
```

```
##
##  Durbin-Watson test
##
## data:  modelo_gamlssN1
## DW = 1.9403, p-value = 0.248
## alternative hypothesis: true autocorrelation is greater than 0
```

```
#Independência
plot(modelo_gamlssN1$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

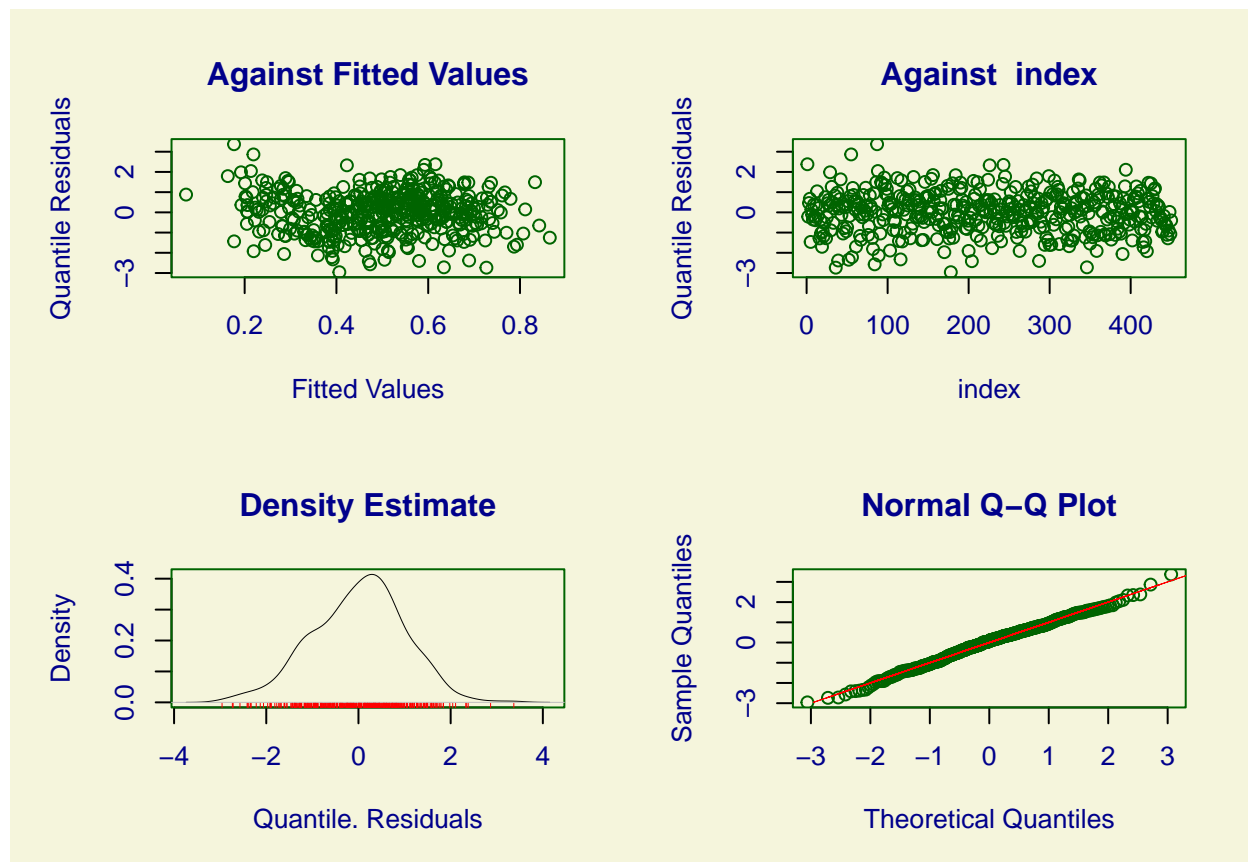
## Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(modelo_gamlssN1) #p-value = 0.001367
```

```
##
## studentized Breusch-Pagan test
##
## data: modelo_gamlssN1
## BP = 15.725, df = 4, p-value = 0.003411
```

```
##### Forward Normal #####
plot(gamlss_normal_forw)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = -6.177916e-16
##              variance = 1.002227
##              coef. of skewness = -0.1543876
##              coef. of kurtosis = 3.054637
## Filliben correlation coefficient = 0.9977486
## *****
```

```
shapiro.test(gamlss_normal_forw$residuals) #p-value = 0.2296, normal
```

```
##
##  Shapiro-Wilk normality test
##
## data:  gamlss_normal_forw$residuals
## W = 0.99555, p-value = 0.2296
```

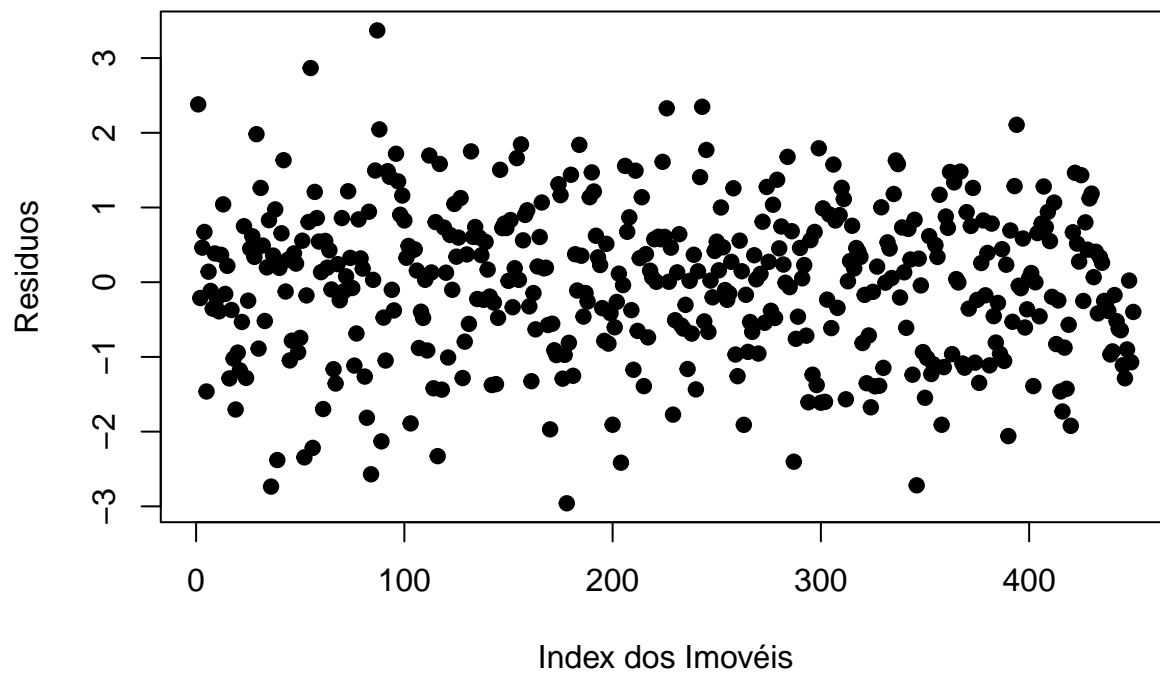
```
#Teste de durbin watson para independencia
library(lmtest)
dwtest(gamlss_normal_forw) #p-value = 0.195
```

```
##
##  Durbin-Watson test
##
## data:  gamlss_normal_forw
## DW = 1.9266, p-value = 0.195
## alternative hypothesis: true autocorrelation is greater than 0
```



```
#Independência
plot(gamlss_normal_forw$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

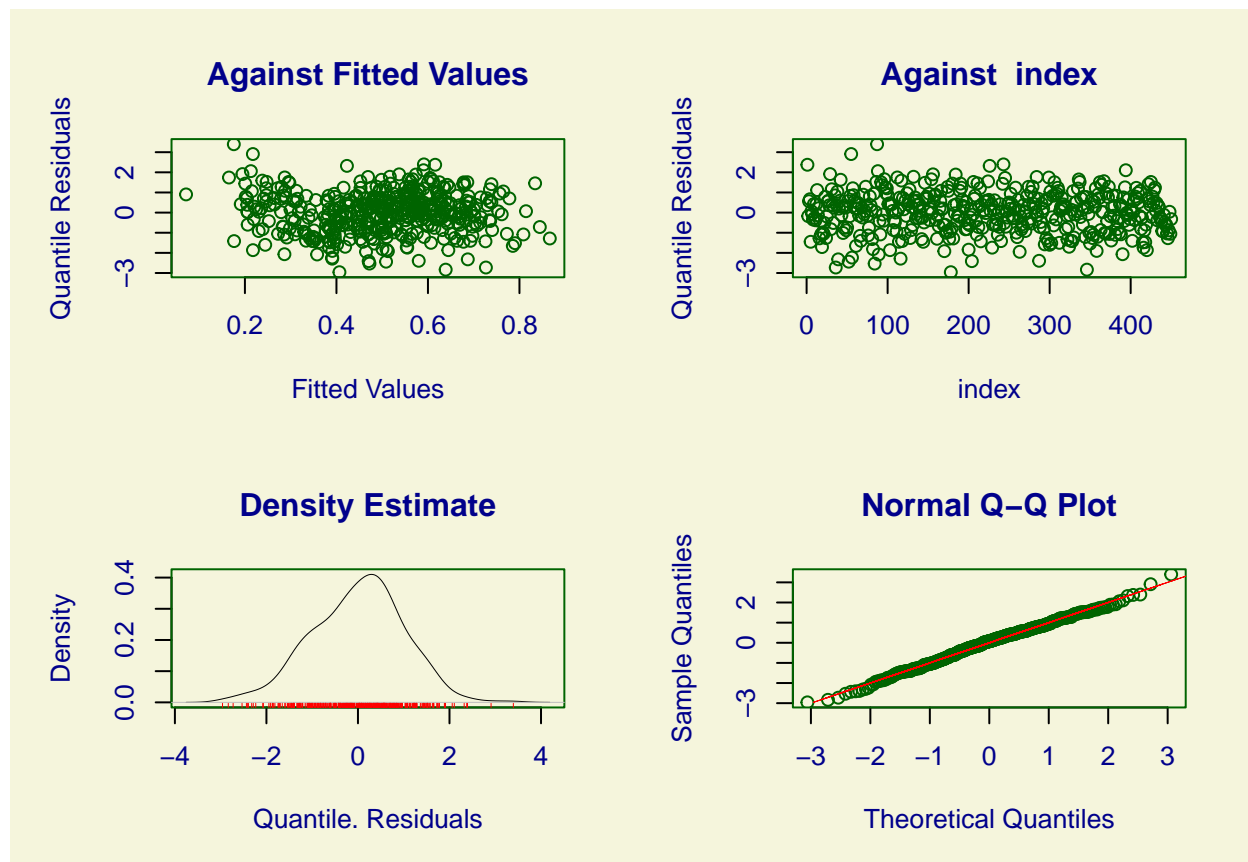
## Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(gamlss_normal_forw) #p-value = 0.001575
```

```
##
## studentized Breusch-Pagan test
##
## data: gamlss_normal_forw
## BP = 17.457, df = 4, p-value = 0.001575
```

```
##### Backward Normal #####
plot(gamlss_normal_back)
```



```
## *****
##      Summary of the Quantile Residuals
##              mean   = -6.621362e-16
##              variance = 1.002227
##              coef. of skewness = -0.1456677
##              coef. of kurtosis = 3.071416
## Filliben correlation coefficient = 0.9978431
## *****
```

```
shapiro.test(gamlss_normal_back$residuals) #p-value = 0.2669, normal
```

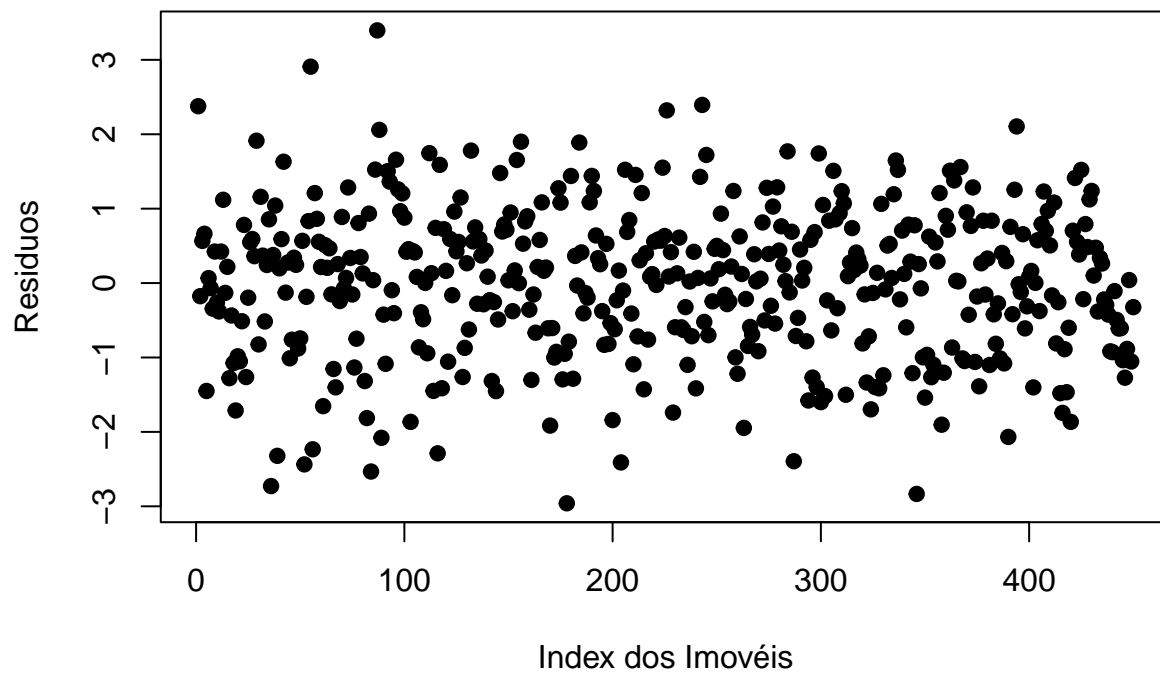
```
##
## Shapiro-Wilk normality test
##
## data:  gamlss_normal_back$residuals
## W = 0.99576, p-value = 0.2669
```

```
#Teste de durbin watson para independencia
library(lmtest)
dwtest(gamlss_normal_back) #p-value = 0.1735
```

```
##
## Durbin-Watson test
##
## data:  gamlss_normal_back
## DW = 1.9193, p-value = 0.1735
## alternative hypothesis: true autocorrelation is greater than 0
```

```
#Independência
plot(gamlss_normal_back$residuals,
     ylab = "Resíduos",
     xlab = "Index dos Imóveis",
     main = "Suposição de independência",
     pch = 19)
```

### Suposição de independência



```
#Breusch_Pagan para homocedasticidade
bptest(gamlss_normal_back) #p-value = 0.0006407
```

```
##
## studentized Breusch-Pagan test
##
## data: gamlss_normal_back
## BP = 19.451, df = 4, p-value = 0.0006407
```