# Avaliação Pontual 3 - Arquivo Rat

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Dados Correlacionados - 11/04/2021

# Avaliação Pontual 3

Especificação das estruturas de média e covariância do modelo linear geral para dados longitudinais com resposta contínua.

Na resolução especifique qual o conjunto (Capítulo) de exercícios você escolheu; apresente os códigos utilizados, as saídas e suas conclusões.

Capítulo 6 (páginas 163 e 164) - arquivo rat.dta.

# Conjunto de Dados Rat - Capítulo 6

In a study of weight gain (Box, 1950) investigators randomly assigned 30 rats to three treatment groups:

treatment 1 was a control (no additive); treatments 2 and 3 consisted of two different additives (thiouracil and thyroxin respectively) to the rats drinking water.

Weight, in grams, was measured at baseline (week 0) and at weeks 1, 2, 3, and 4.

Due to an accident at the beginning of the study, data on 3 rats from the thyroxin group are unavailable.

The variable Group is coded 1 = control, 2 = thiouracil, and 3 = thyroxin.

```
## # A tibble: 6 x 7
##
         id group
                                                    y5
                       у1
                              y2
                                     у3
                                            y4
      <dbl> <
##
## 1
                 1
                       57
                              86
                                    114
                                            139
## 2
          2
                 1
                       60
                              93
                                    123
                                            146
                                                  177
                       52
## 3
          3
                 1
                              77
                                    111
                                           144
                                                  185
                       49
## 4
          4
                 1
                              67
                                    100
                                           129
                                                  164
## 5
          5
                 1
                       56
                              81
                                    104
                                           121
                                                  151
## 6
                       46
                              70
                                    102
                                           131
                                                  153
```

### Remodelando e Transformando os Dados

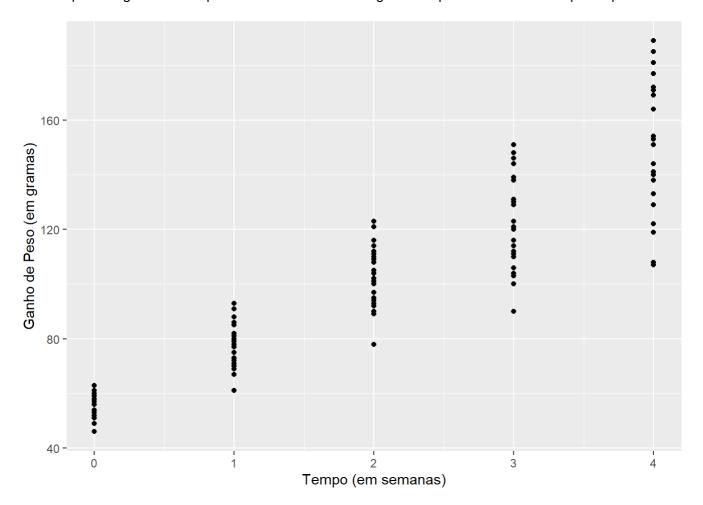
Para melhor trabalhar e analisar os dados longitudinais, utilizamos o formato 'longo' ao invés do formato 'largo' da seguinte forma: as medidas repetidas são empilhadas em uma única coluna; a coluna id, e demais covariáveis fixas no tempo, repetem o seu valor; e uma nova coluna que indexa as ocasiões, ou com os valores dos tempos de medição, é criada.

```
## # A tibble: 10 x 5
         id group
                     tempo
                             peso tempo.f
##
                     <dbl> <dbl> <fct>
##
      <dbl> <fct>
##
    1
          1 control
                               57 0
    2
                               60 0
##
          2 control
                          0
    3
##
          3 control
                          0
                               52 0
    4
          4 control
                          0
                               49 0
##
    5
##
          5 control
                          0
                               56 0
    6
          6 control
                               46 0
##
##
    7
          7 control
                               51 0
##
    8
          8 control
                               63 0
                               49 0
##
   9
          9 control
                          0
                               57 0
## 10
         10 control
                          0
```

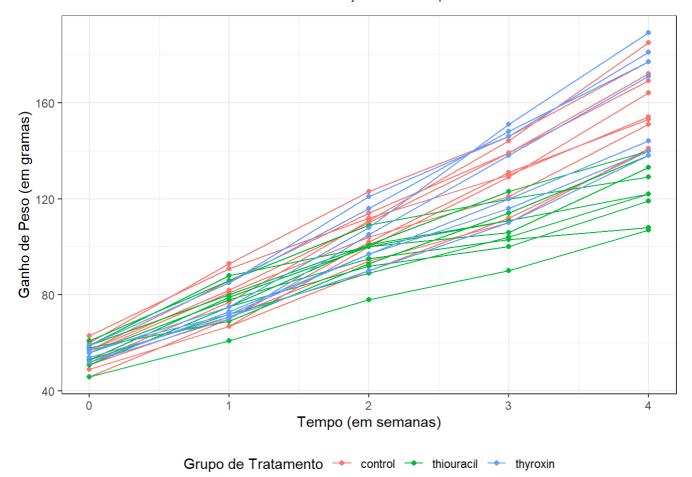
#### Time Plot

Utilizaremos o time plot para observar as trajetórias individuais, tendências, variabilidade entre e dentro de indivíduos (leia-se ratinhos).

Primeiro pelo Diagrama de Dispersão. Onde notamos um ganho de peso conforme o tempo vai passando.

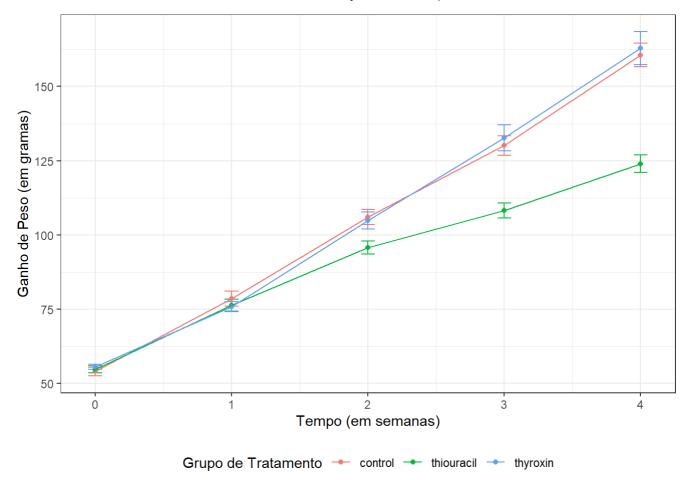


E também pelos Perfis Individuais (Spaghetti).

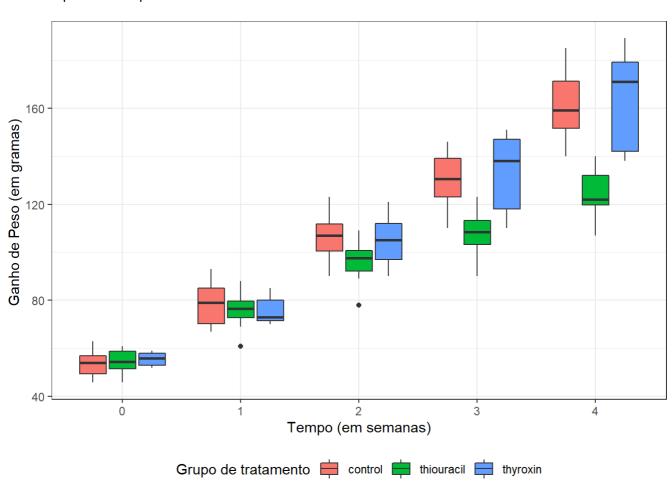


Para uma análise mais informativa, utilizaremos também os Perfis de Médias (com barras de erros + boxplot).

```
##
           group tempo peso.m
                                     dp
## 1
         control
                         54.0
                               5.436502 1.403699
## 2
         control
                     1
                         78.5
                               9.640770 2.489236
## 3
         control
                        106.0 9.921917 2.561828
                        130.1 12.564942 3.244254
## 4
         control
                        160.6 15.196491 3.923717
## 5
         control
      thiouracil
                         54.7
                               4.691600 1.211366
                     0
## 6
## 7
      thiouracil
                         76.3 7.916930 2.044142
                     1
      thiouracil
                     2
                         95.8 8.495751 2.193593
## 8
## 9
      thiouracil
                        108.2 9.750214 2.517494
## 10 thiouracil
                        124.0 11.254629 2.905933
```



Os grupos de tratamento control e thyroxin apresentam um comportamento muito semelhante nos grupos conforme passa o tempo.

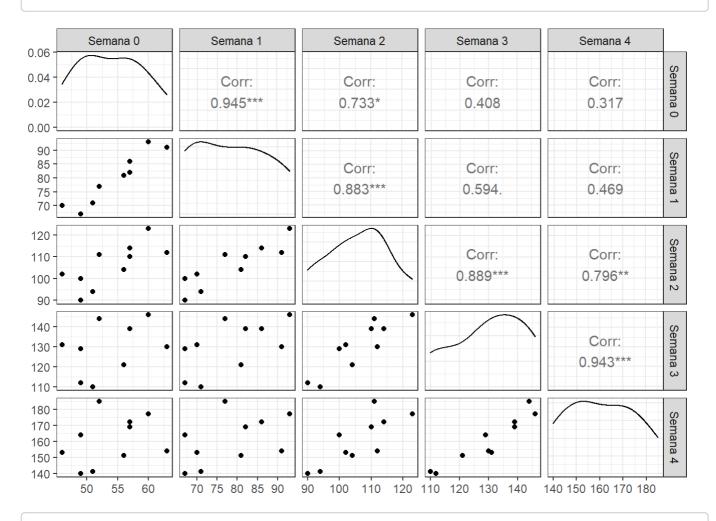


# Estrutura de Correlação

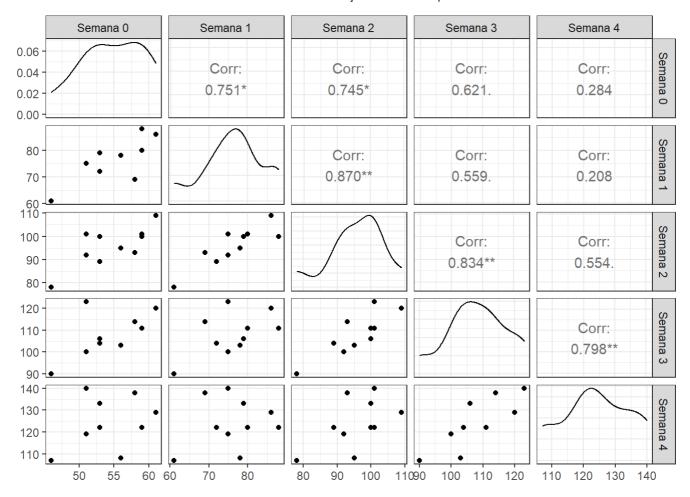


Estrutura de correlação para os diferentes grupos de tratamento.

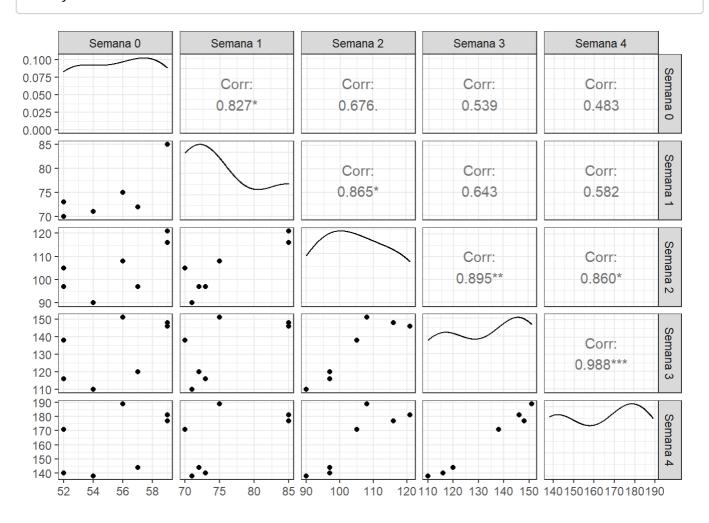
## control



## thiouracil



#### ## thyroxin



### Modelo de Perfis de Respostas

```
## Generalized least squares fit by REML
    Model: peso ~ group * tempo
##
    Data: ratos.longo
         AIC
##
                  BIC
                          logLik
##
    854.5993 914.6554 -406.2996
##
## Correlation Structure: General
## Formula: ~1 | id
   Parameter estimate(s):
   Correlation:
    1
          2
                3
## 2 0.869
## 3 0.714 0.852
## 4 0.456 0.518 0.813
## 5 0.228 0.255 0.634 0.904
## Variance function:
## Structure: Different standard deviations per stratum
  Formula: ~1 | tempo
   Parameter estimates:
                   1
##
                            2
## 1.000000 1.908210 2.082301 2.638103 3.269681
## Coefficients:
##
                           Value Std.Error t-value p-value
## (Intercept)
                        55.35233 1.310735 42.22998 0.0000
## groupthiouracil
                        -1.91155 1.853660 -1.03123 0.3044
## groupthyroxin
                         3.00597 2.042634 1.47162 0.1436
                        26.17850 1.042360 25.11465 0.0000
## groupthiouracil:tempo -7.52867 1.474119 -5.10723 0.0000
## groupthyroxin:tempo
                        -1.41434 1.624400 -0.87068 0.3855
##
##
   Correlation:
##
                        (Intr) grpthr grpthy tempo grpthr:
## groupthiouracil
                        -0.707
## groupthyroxin
                         -0.642 0.454
## tempo
                         0.284 -0.201 -0.183
## groupthiouracil:tempo -0.201 0.284 0.129 -0.707
## groupthyroxin:tempo
                         -0.183 0.129 0.284 -0.642 0.454
##
## Standardized residuals:
          Min
                       Q1
                                  Med
                                                Q3
                                                          Max
## -1.89467664 -0.92721925 -0.00962018 0.73647815 1.95700324
## Residual standard error: 4.93611
## Degrees of freedom: 135 total; 129 residual
```

#### Matriz de Covariância Estimada

24.4	44.1	56.9	21.2	14.7
44.1	105.6	141.4	50.1	34.1
56.9	141.4	260.5	123.7	133.3

21.2	50.1	123.7	88.7	110.8
14.7	34.1	133.3	110.8	169.6

Aumento perceptível na variância dos ganhos de peso dos ratos.

#### Teste de Wald

	Df	Chisq	Pr(>Chisq)
group	2	3.39	0.1834
tempo	1	1317.25	0.0000
group:tempo	2	28.72	0.0000

Rejeitamos a hipótese de ausência de efeito de interação grupo x tempo.

## Teste da Razão de Verossimilhança

```
## Model df AIC BIC logLik Test L.Ratio p-value
## modelo.completo 1 21 867.5989 928.6097 -412.7995
## modelo.reduzido 2 19 878.2347 933.4349 -420.1174 1 vs 2 14.6358 7e-04
```

Como p-valor < 0.001, então rejeitamos a hipótese de ausência de efeito de interação, portanto o modelo completo é mais adequado para descrever os dados.

#### Coeficientes Estimados

	Estimativa	EP	Z
(Intercept)	55.352	1.311	42.23
groupthiouracil	-1.912	1.854	-1.03
groupthyroxin	3.006	2.043	1.47
tempo	26.178	1.042	25.11
groupthiouracil:tempo	-7.529	1.474	-5.11
groupthyroxin:tempo	-1.414	1.624	-0.87

## Modelo Spline Linear

```
## Generalized least squares fit by REML
        Model: peso \sim lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = 1, marginal = TRUE) + lspline(x = semana, knots = 1, marginal = 1,
knots = 1, marginal = TRUE):group
##
        Data: ratos.longo
##
                  AIC
                                  BIC
                                             logLik
##
        839.5219 902.2666 -397.761
##
## Correlation Structure: General
## Formula: ~tempo | id
## Parameter estimate(s):
## Correlation:
##
        1
                   2
                              3
## 2 0.842
## 3 0.676 0.853
## 4 0.450 0.522 0.815
## 5 0.305 0.364 0.699 0.931
## Variance function:
## Structure: Different standard deviations per stratum
## Formula: ~1 | tempo
## Parameter estimates:
                                                   3
## 1.000000 1.816880 2.172740 2.923265 3.558180
##
## Coefficients:
##
                                                                                                                                 Value
## (Intercept)
                                                                                                                            54.56803
## lspline(x = semana, knots = 1, marginal = TRUE)1
                                                                                                                            24.17461
## lspline(x = semana, knots = 1, marginal = TRUE)2
                                                                                                                              4.18747
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil -4.55435
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil -5.82764
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                                                                            -4.58261
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                                                                             5.70444
##
                                                                                                                            Std.Error
## (Intercept)
                                                                                                                            0.8599471
## lspline(x = semana, knots = 1, marginal = TRUE)1
                                                                                                                            1.3624983
## lspline(x = semana, knots = 1, marginal = TRUE)2
                                                                                                                            1.9581475
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil 1.8297904
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil 2.6646935
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                                                                            2.0163308
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                                                                            2.9363492
##
                                                                                                                              t-value
## (Intercept)
                                                                                                                            63.45510
## lspline(x = semana, knots = 1, marginal = TRUE)1
                                                                                                                            17.74286
## lspline(x = semana, knots = 1, marginal = TRUE)2
                                                                                                                              2.13848
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil -2.48900
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil -2.18698
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                                                                            -2.27275
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                                                                              1.94270
##
                                                                                                                            p-value
## (Intercept)
                                                                                                                              0.0000
## lspline(x = semana, knots = 1, marginal = TRUE)1
                                                                                                                              0.0000
## lspline(x = semana, knots = 1, marginal = TRUE)2
                                                                                                                              0.0344
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil
                                                                                                                             0.0141
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil
                                                                                                                              0.0306
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                                                                              0.0247
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                                                                              0.0542
```

```
## Correlation:
##
                                                                     (Intr)
## lspline(x = semana, knots = 1, marginal = TRUE)1
                                                                     0.313
## lspline(x = semana, knots = 1, marginal = TRUE)2
                                                                     -0.272
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil
                                                                     0.000
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil
                                                                     0.000
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                     0.000
                                                                     0.000
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
##
                                                                     ls(=s,k=1,m=TRUE)1
## lspline(x = semana, knots = 1, marginal = TRUE)1
## lspline(x = semana, knots = 1, marginal = TRUE)2
                                                                     -0.666
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil -0.671
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil 0.427
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                     -0.609
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                     0.387
##
                                                                     ls(=s,k=1,m=TRUE)2
## lspline(x = semana, knots = 1, marginal = TRUE)1
## lspline(x = semana, knots = 1, marginal = TRUE)2
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil 0.432
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil -0.680
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                     -0.617
##
                                                                     lspln(x=smn,knts=1,mrgnl=
TRUE)1:grpthr
## lspline(x = semana, knots = 1, marginal = TRUE)1
## lspline(x = semana, knots = 1, marginal = TRUE)2
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil -0.635
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                     0.454
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                     -0.288
##
                                                                     lspln(x=smn,knts=1,mrgnl=
TRUE)2:grpthr
## lspline(x = semana, knots = 1, marginal = TRUE)1
## lspline(x = semana, knots = 1, marginal = TRUE)2
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
                                                                     -0.288
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                     0.454
##
                                                                     lspln(x=smn,knts=1,mrgnl=
TRUE)1:grpthy
## lspline(x = semana, knots = 1, marginal = TRUE)1
## lspline(x = semana, knots = 1, marginal = TRUE)2
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil
## lspline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin
## lspline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin
                                                                     -0.635
##
## Standardized residuals:
##
           Min
                                   Med
                                                Q3
                                                           Max
## -1.93333641 -0.67860948 0.06464495 0.74415319 1.87124439
##
## Residual standard error: 4.506078
## Degrees of freedom: 135 total; 128 residual
```

Estimativa EP Z

	Estimativa	EP	Z
(Intercept)	54.5680	0.8599	63.46
Ispline(x = semana, knots = 1, marginal = TRUE)1	24.1746	1.3625	17.74
lspline(x = semana, knots = 1, marginal = TRUE)2	4.1875	1.9581	2.14
lspline(x = semana, knots = 1, marginal = TRUE)1:groupthiouracil	-4.5544	1.8298	-2.49
Ispline(x = semana, knots = 1, marginal = TRUE)2:groupthiouracil	-5.8276	2.6647	-2.19
Ispline(x = semana, knots = 1, marginal = TRUE)1:groupthyroxin	-4.5826	2.0163	-2.27
Ispline(x = semana, knots = 1, marginal = TRUE)2:groupthyroxin	5.7044	2.9363	1.94

```
## # Predicted values of id
## # x = semana
##
## # group = control
##
## x | Predicted
## -----
## 0 |
        54.57
## 1 |
        78.74
## 2 |
      107.10
## 3 | 135.47
## 4
        163.83
## # group = thiouracil
##
## x | Predicted
## -----
## 0 |
        54.57
## 1 |
        74.19
## 2
        92.17
## 3
      110.15
## 4
        128.13
##
## # group = thyroxin
## x | Predicted
## -----
## 0 |
        54.57
## 1
        74.16
## 2 | 103.64
## 3
      133.13
## 4 |
        162.61
##
## Adjusted for:
## * tempo = 3.00
## * id = 14.00
```

