

```
> #Exercise 1
[1] "The number of students is 340823"
[1] "The number of schools is 640"
[1] "The number of programs is 32"
[1] "The number of choices is 5546"
[1] "The number of missing test score is 179887"
[1] "The number of Apply to the same school (different programs) is 5546"
[1] "The number of Apply to less than 6 choices is 18954"
```

```
> #Exercise 2
[1] "The answer for Exercise 2 is Choicescore"
> head(Choicescore, 20)
```

| | schoolcode | choice | X | score | agey | male |
|-----|------------|------------------|--------|-------|------|------|
| 1 | 10101 | 10101Agriculture | 230518 | 288 | 15 | 1 |
| 7 | 10101 | 10101Agriculture | 230756 | 288 | 14 | 0 |
| 13 | 10101 | 10101Agriculture | 230824 | 288 | 19 | 1 |
| 19 | 10101 | 10101Agriculture | 230386 | 289 | 17 | 0 |
| 25 | 10101 | 10101Agriculture | 230627 | 291 | 16 | 1 |
| 31 | 10101 | 10101Agriculture | 230893 | 292 | 16 | 0 |
| 37 | 10101 | 10101Agriculture | 230927 | 293 | 16 | 0 |
| 43 | 10101 | 10101Agriculture | 230694 | 294 | 16 | 1 |
| 49 | 10101 | 10101Agriculture | 230578 | 295 | 19 | 1 |
| 55 | 10101 | 10101Agriculture | 230512 | 295 | 17 | 1 |
| 61 | 10101 | 10101Agriculture | 230546 | 296 | 15 | 0 |
| 67 | 10101 | 10101Agriculture | 230427 | 297 | 15 | 0 |
| 73 | 10101 | 10101Agriculture | 230655 | 298 | 17 | 1 |
| 79 | 10101 | 10101Agriculture | 230637 | 298 | 16 | 1 |
| 85 | 10101 | 10101Agriculture | 230918 | 298 | 17 | 1 |
| 91 | 10101 | 10101Agriculture | 230464 | 299 | 16 | 1 |
| 97 | 10101 | 10101Agriculture | 230695 | 299 | 16 | 1 |
| 103 | 10101 | 10101Agriculture | 230505 | 300 | 16 | 1 |
| 109 | 10101 | 10101Agriculture | 230816 | 302 | 20 | 1 |
| 115 | 10101 | 10101Agriculture | 230801 | 303 | 19 | 0 |

| | choicepgm | jssdistrict | rankplace | cutoff |
|-----|-------------|-----------------------|-----------|--------|
| 1 | Agriculture | Accra Metropolitan | 3 | 288 |
| 7 | Agriculture | Accra Metropolitan | 3 | 288 |
| 13 | Agriculture | Accra Metropolitan | 3 | 288 |
| 19 | Agriculture | Kumasi Metro | 1 | 288 |
| 25 | Agriculture | Kumasi Metro | 4 | 288 |
| 31 | Agriculture | Ga West (Amasaman) | 3 | 288 |
| 37 | Agriculture | Tema | 4 | 288 |
| 43 | Agriculture | Ga West (Amasaman) | 4 | 288 |
| 49 | Agriculture | Accra Metropolitan | 2 | 288 |
| 55 | Agriculture | Wassa West (Tarkwa) | 3 | 288 |
| 61 | Agriculture | Accra Metropolitan | 3 | 288 |
| 67 | Agriculture | Accra Metropolitan | 1 | 288 |
| 73 | Agriculture | Accra Metropolitan | 1 | 288 |
| 79 | Agriculture | Mfantsiman (Saltpond) | 2 | 288 |
| 85 | Agriculture | Accra Metropolitan | 4 | 288 |
| 91 | Agriculture | Mfantsiman (Saltpond) | 2 | 288 |
| 97 | Agriculture | Accra Metropolitan | 4 | 288 |
| 103 | Agriculture | Ga West (Amasaman) | 3 | 288 |

```

109 Agriculture      Ga West  (Amasaman)          1      288
115 Agriculture      Ga West  (Amasaman)          2      288
      quality size                                schoolname
1   309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
7   309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
13  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
19  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
25  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
31  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
37  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
43  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
49  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
55  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
61  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
67  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
73  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
79  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
85  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
91  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
97  309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
103 309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
109 309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
115 309.0889      45 EBENEZER SENIOR HIGH. SCHOOL, DANSOMAN
      sssdistrict      ssslong      ssslat
1   Accra Metropolitan -0.1971153  5.607396
7   Accra Metropolitan -0.1971153  5.607396
13  Accra Metropolitan -0.1971153  5.607396
19  Accra Metropolitan -0.1971153  5.607396
25  Accra Metropolitan -0.1971153  5.607396
31  Accra Metropolitan -0.1971153  5.607396
37  Accra Metropolitan -0.1971153  5.607396
43  Accra Metropolitan -0.1971153  5.607396
49  Accra Metropolitan -0.1971153  5.607396
55  Accra Metropolitan -0.1971153  5.607396
61  Accra Metropolitan -0.1971153  5.607396
67  Accra Metropolitan -0.1971153  5.607396
73  Accra Metropolitan -0.1971153  5.607396
79  Accra Metropolitan -0.1971153  5.607396
85  Accra Metropolitan -0.1971153  5.607396
91  Accra Metropolitan -0.1971153  5.607396
97  Accra Metropolitan -0.1971153  5.607396
103 Accra Metropolitan -0.1971153  5.607396
109 Accra Metropolitan -0.1971153  5.607396
115 Accra Metropolitan -0.1971153  5.607396

```

```

> #Exercise 3
[1] "The answer for Exercise 3 is the variable Distance in the dataframe
Dis"
> head(Dis, 20)

```

```
jssdistrict schoolcode
```

| | | | |
|--------|------------------------|----------------|-------|
| 19679 | | Agona Swedru | 30403 |
| 20031 | | Agona Swedru | 30403 |
| 428 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 461 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 15 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 161 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 17 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 33 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 21640 | Ajumako/Enyan/Essiam | (Ajumako) | 30403 |
| 21848 | Ajumako/Enyan/Essiam | (Ajumako) | 30403 |
| 128201 | Twifo Hemang | (Twifo Praso) | 30403 |
| 128284 | Twifo Hemang | (Twifo Praso) | 30403 |
| 37302 | Awutu/Efutu/Senya | (Winneba) | 30403 |
| 37395 | Awutu/Efutu/Senya | (Winneba) | 30403 |
| 96339 | Mfantsiman | (Saltpond) | 30403 |
| 96639 | Mfantsiman | (Saltpond) | 30403 |
| 60 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 141 | Abura/Asebu/Kwamankese | (Abura Dunkwa) | 30403 |
| 96923 | Mfantsiman | (Saltpond) | 30403 |
| 97032 | Mfantsiman | (Saltpond) | 30403 |

| | choice | X | score | agey | male |
|--|--------|---|-------|------|------|
|--|--------|---|-------|------|------|

| | | | | | |
|--------|---------------------|--------|-----|----|---|
| 19679 | 30403General Arts | 179888 | 249 | 16 | 0 |
| 20031 | 30403General Arts | 179888 | 249 | 16 | 0 |
| 428 | 30403Agriculture | 179890 | 254 | 19 | 1 |
| 461 | 30403Agriculture | 179890 | 254 | 19 | 1 |
| 15 | 30403Home Economics | 179891 | 277 | 17 | 0 |
| 161 | 30403Home Economics | 179891 | 277 | 17 | 0 |
| 17 | 30403General Arts | 179892 | 236 | 16 | 0 |
| 33 | 30403General Arts | 179892 | 236 | 16 | 0 |
| 21640 | 30403General Arts | 179893 | 237 | 18 | 1 |
| 21848 | 30403General Arts | 179893 | 237 | 18 | 1 |
| 128201 | 30403Agriculture | 179894 | 262 | 16 | 0 |
| 128284 | 30403Agriculture | 179894 | 262 | 16 | 0 |
| 37302 | 30403General Arts | 179895 | 249 | 15 | 1 |
| 37395 | 30403General Arts | 179895 | 249 | 15 | 1 |
| 96339 | 30403General Arts | 179896 | 229 | 17 | 0 |
| 96639 | 30403General Arts | 179896 | 229 | 17 | 0 |
| 60 | 30403General Arts | 179897 | 219 | 18 | 1 |
| 141 | 30403General Arts | 179897 | 219 | 18 | 1 |
| 96923 | 30403Agriculture | 179898 | 227 | 17 | 0 |
| 97032 | 30403Agriculture | 179898 | 227 | 17 | 0 |

| | choicepgm | rankplace | cutoff | quality | size |
|--------|----------------|-----------|--------|----------|------|
| 19679 | General Arts | 5 | 208 | 242.0857 | 35 |
| 20031 | General Arts | 5 | 208 | 242.0857 | 35 |
| 428 | Agriculture | 2 | 219 | 241.9333 | 15 |
| 461 | Agriculture | 2 | 219 | 241.9333 | 15 |
| 15 | Home Economics | 4 | 215 | 248.3750 | 8 |
| 161 | Home Economics | 4 | 215 | 248.3750 | 8 |
| 17 | General Arts | 3 | 208 | 242.0857 | 35 |
| 33 | General Arts | 3 | 208 | 242.0857 | 35 |
| 21640 | General Arts | 1 | 208 | 242.0857 | 35 |
| 21848 | General Arts | 1 | 208 | 242.0857 | 35 |
| 128201 | Agriculture | 6 | 219 | 241.9333 | 15 |
| 128284 | Agriculture | 6 | 219 | 241.9333 | 15 |

| | | | | | |
|-------|--------------|---|-----|----------|----|
| 37302 | General Arts | 5 | 208 | 242.0857 | 35 |
| 37395 | General Arts | 5 | 208 | 242.0857 | 35 |
| 96339 | General Arts | 1 | 208 | 242.0857 | 35 |
| 96639 | General Arts | 1 | 208 | 242.0857 | 35 |
| 60 | General Arts | 6 | 208 | 242.0857 | 35 |
| 141 | General Arts | 6 | 208 | 242.0857 | 35 |
| 96923 | Agriculture | 3 | 219 | 241.9333 | 15 |
| 97032 | Agriculture | 3 | 219 | 241.9333 | 15 |

schoolname

| | |
|--------|--------------------------------------|
| 19679 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 20031 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 428 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 461 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 15 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 161 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 17 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 33 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 21640 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 21848 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 128201 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 128284 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 37302 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 37395 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 96339 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 96639 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 60 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 141 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |
| 96923 | ABAKRAMPA SENIOR HIGH TECHNICAL |
| 97032 | <d8>?ABAKRAMPA SENIOR HIGH TECHNICAL |

sssdistrict ssslong

| | | |
|--------|---------------------------------------|-----------|
| 19679 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 20031 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 428 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 461 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 15 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 161 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 17 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 33 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 21640 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 21848 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 128201 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 128284 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 37302 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 37395 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 96339 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 96639 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 60 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 141 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 96923 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |
| 97032 | Abura/Asebu/Kwamankese (Abura Dunkwa) | -1.197088 |

ssslat point_x point_y Distance

| | | | | |
|-------|----------|------------|----------|----------|
| 19679 | 5.130001 | -0.7552425 | 5.617353 | 45.40499 |
| 20031 | 5.130001 | -0.7552425 | 5.617353 | 45.40499 |
| 428 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |

| | | | | |
|--------|----------|------------|----------|----------|
| 461 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 15 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 161 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 17 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 33 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 21640 | 5.130001 | -1.0053846 | 5.401725 | 22.96873 |
| 21848 | 5.130001 | -1.0053846 | 5.401725 | 22.96873 |
| 128201 | 5.130001 | -1.5597034 | 5.572999 | 39.52487 |
| 128284 | 5.130001 | -1.5597034 | 5.572999 | 39.52487 |
| 37302 | 5.130001 | -0.5086389 | 5.544896 | 55.41003 |
| 37395 | 5.130001 | -0.5086389 | 5.544896 | 55.41003 |
| 96339 | 5.130001 | -1.0064534 | 5.201528 | 14.03343 |
| 96639 | 5.130001 | -1.0064534 | 5.201528 | 14.03343 |
| 60 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 141 | 5.130001 | -1.1970884 | 5.130001 | 0.00000 |
| 96923 | 5.130001 | -1.0064534 | 5.201528 | 14.03343 |
| 97032 | 5.130001 | -1.0064534 | 5.201528 | 14.03343 |

> #Exercise 4

```
[1] "For 1st Rankplace"
[1] "The average of the cutoff is 281.666696851018"
[1] "The sd of the cutoff is 58.8290705689274"
[1] "The average of the Quality is 308.362561581667"
[1] "The sd of the Quality is 52.1712365763513"
[1] "The average of the Distance is 35.1811012348586"
[1] "The sd of the Distance is 52.8207408451784"
[1] "For 2nd Rankplace"
[1] "The average of the cutoff is 275.943484190162"
[1] "The sd of the cutoff is 51.1390749676321"
[1] "The average of the Quality is 301.936452507742"
[1] "The sd of the Quality is 44.5486524805607"
[1] "The average of the Distance is 34.0217710653266"
[1] "The sd of the Distance is 48.4151155841386"
[1] "For 3rd Rankplace"
[1] "The average of the cutoff is 261.26926286509"
[1] "The sd of the cutoff is 43.8014658133546"
[1] "The average of the Quality is 288.566888990669"
[1] "The sd of the Quality is 37.492231591051"
[1] "The average of the Distance is 28.6654303706568"
[1] "The sd of the Distance is 43.3276802542669"
[1] "For 4th Rankplace"
[1] "The average of the cutoff is 247.957375629723"
[1] "The sd of the cutoff is 37.6479586381162"
[1] "The average of the Quality is 276.922107837596"
[1] "The sd of the Quality is 31.7422473327192"
[1] "The average of the Distance is 22.8660114943869"
[1] "The sd of the Distance is 38.671561364868"
[1] "For 5th Rankplace"
[1] "The average of the cutoff is 211.090909090909"
```

```

[1] "The sd of the cutoff is 8.18112838937557"
[1] "The average of the Quality is 251.778416288314"
[1] "The sd of the Quality is 12.7789805612124"
[1] "The average of the Distance is 32.3881553859471"
[1] "The sd of the Distance is 30.5839074535372"
[1] "For 6th Rankplace"
[1] "The average of the cutoff is 211.181939353549"
[1] "The sd of the cutoff is 8.20046057879195"
[1] "The average of the Quality is 249.449253381274"
[1] "The sd of the Quality is 11.2054957202403"
[1] "The average of the Distance is 31.9538100119105"
[1] "The sd of the Distance is 29.7359428251178"
> #=====
> Quantiles<- Dis[order(Dis$score, Dis$X),]
[1] "For 1st quantile"
[1] "The average of the cutoff is 216.727445079747"
[1] "The sd of the cutoff is 13.7504012401409"
[1] "The average of the Quality is 250.98769286784"
[1] "The sd of the Quality is 12.2768746968854"
[1] "The average of the Distance is 25.97192694149"
[1] "The sd of the Distance is 42.6813644020342"
[1] "For 2nd quantile"
[1] "The average of the cutoff is 228.874516582679"
[1] "The sd of the cutoff is 22.3503980789819"
[1] "The average of the Quality is 261.097918819516"
[1] "The sd of the Quality is 17.9526811040484"
[1] "The average of the Distance is 27.4219464315344"
[1] "The sd of the Distance is 45.9810011218846"
[1] "For 3rd quantile"
[1] "The average of the cutoff is 243.377261994572"
[1] "The sd of the cutoff is 32.1635880454268"
[1] "The average of the Quality is 273.609336668229"
[1] "The sd of the Quality is 26.5693976879494"
[1] "The average of the Distance is 28.7161280998983"
[1] "The sd of the Distance is 46.5872322494831"
[1] "For 4th quantile"
[1] "The average of the cutoff is 266.199677056391"
[1] "The sd of the cutoff is 52.0582572606955"
[1] "The average of the Quality is 293.943176433258"
[1] "The sd of the Quality is 45.4150688237614"
[1] "The average of the Distance is 31.1064247813155"
[1] "The sd of the Distance is 46.6952354382574"

> #Exercise 5
> head(Y, 20)
[1] 1.9032843 -3.1350882 3.8277599 1.5970899 1.9943875
[6] 4.5373519 -4.1700785 -4.7640866 -0.3120093 -2.4801004
[11] -1.9839194 0.9860258 2.1066723 1.9385475 0.8920039
[16] 3.2090729 -3.6149303 -1.3973371 -0.9666107 -3.7247639
> head(ydum, 20)
[1] 1 0 1 1 1 1 0 0 1 0 0 1 1 1 1 1 0 0 0 0

```

```

> #Exercise 6
[1] "The correlation coefficient between Y and X1 is 0.209429106418655"
[1] "The regression coefficient between Y and X1 is 1.19218588123404"
[1] "The difference from 1.2 is -0.0078141187659575"
The regression result is  $Y = 2.550967 + 1.192186 X_1 - 0.9046174 X_2 + 0.1099006 X_3 + e$ 
The coefficients are 2.550967 1.192186 -0.9046174 0.1099006
The standard errors in this OLS are 0.04093615 0.01748154 0.002925907 0.02176734

> #Exercise 7
> #Probit Model=====
'log Lik.' -2161.466 (df=4)
  True parameter R: GLM : est R: own :se R: GLM :se
      2.5509674      2.9654092 0.10011006 0.10011170
X1      1.1921859      1.2343270 0.04458552 0.04463045
X2     -0.9046174     -0.9199287 0.01886599 0.01884960
X3      0.1099006      0.1354812 0.04694495 0.04705767

> #Logit Model=====
'log Lik.' -2167.151 (df=4)
  True parameter R: GLM : est R: own :se R: GLM :se
      2.5509674      5.3212472 0.18728370 0.10011170
X1      1.1921859      2.2190576 0.08304348 0.04463045
X2     -0.9046174     -1.6529784 0.03763265 0.01884960
X3      0.1099006      0.2439212 0.08434958 0.04705767
> #linear probability model=====
  True parameter      Probit      Logit      LPM
      2.5509674      2.9654092      5.3212472      0.89111066
X1      1.1921859      1.2343270      2.2190576      0.14521037
X2     -0.9046174     -0.9199287     -1.6529784     -0.10485191
X3      0.1099006      0.1354812      0.2439212      0.01078067

[1] "Conclusion: the positive and negative signal of coefficients are
same"
[1] "For the intercept, X1 and X2, all the three models hold 0.001
significant level"
[1] "But for X3, the Probit and Logit models hold 0.01 significant level.
But for LPM, the X3 is not significant."

```

```

> #Exercise 8
> # Probit Model
Marginal Effects:
      dF/dx   Std. Err.      z    P>|z|
X1   0.4924149   0.0177859   27.6857 < 2e-16 ***
X2  -0.3669907   0.0075174  -48.8187 < 2e-16 ***
X3   0.0539974   0.0186723    2.8918 0.00383 **
---
Signif. codes:
0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

> # Logit Model
Marginal Effects:
      dF/dx   Std. Err.      z    P>|z|
X1   0.5547272   0.0207585   26.723 < 2e-16 ***
X2  -0.4132169   0.0093871  -44.020 < 2e-16 ***
X3   0.0608904   0.0209894    2.901 0.00372 **
---
Signif. codes:
0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

```