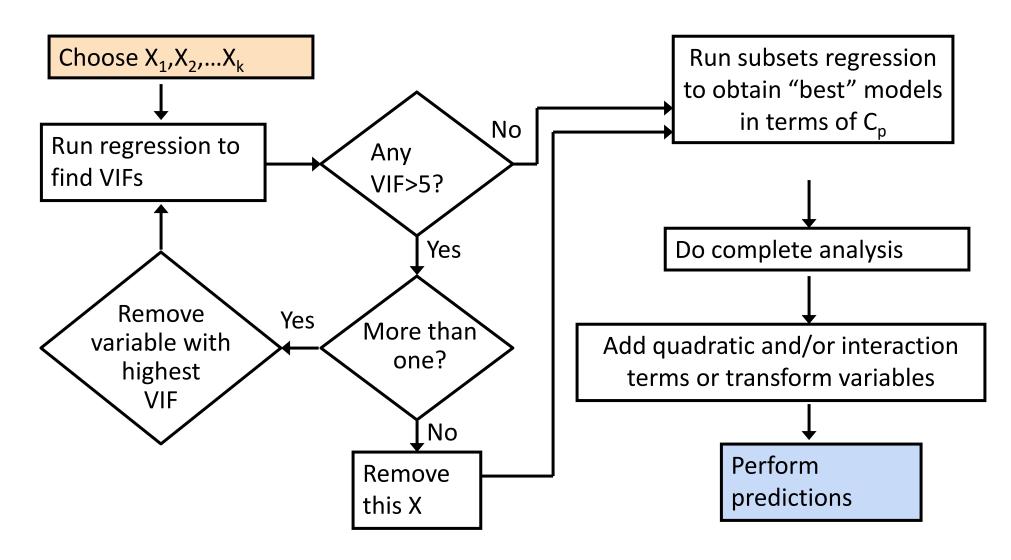
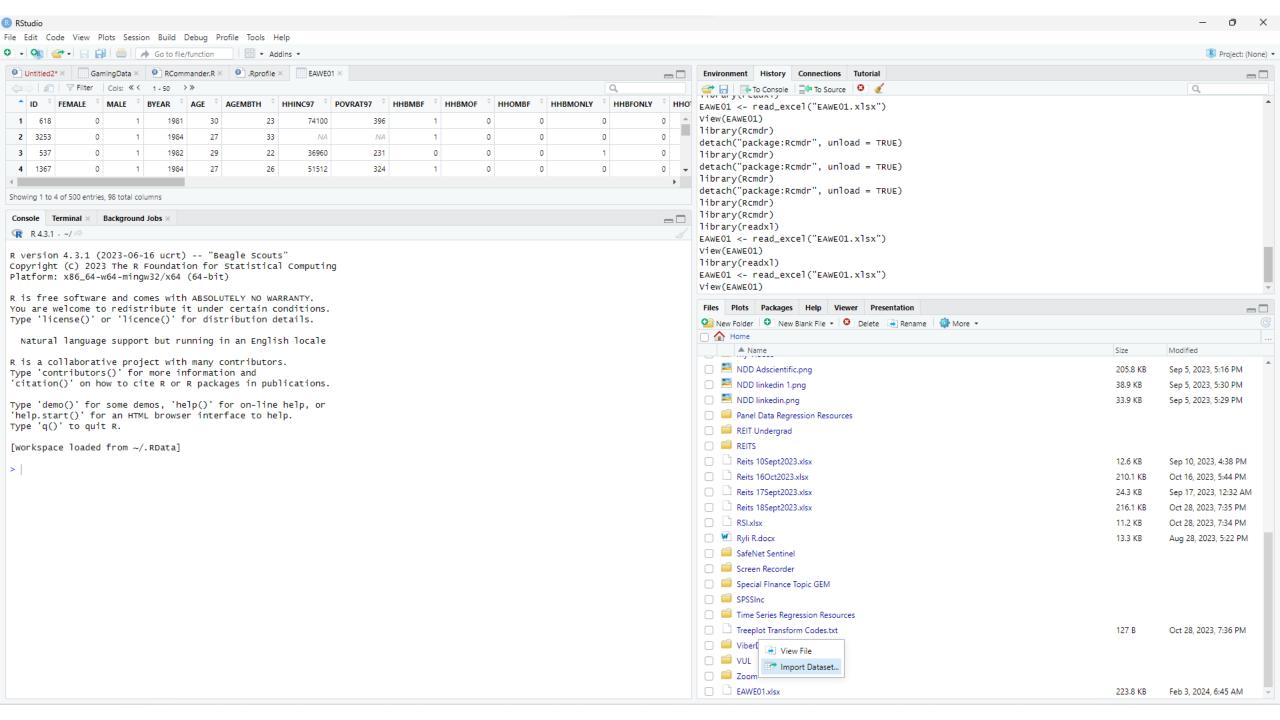
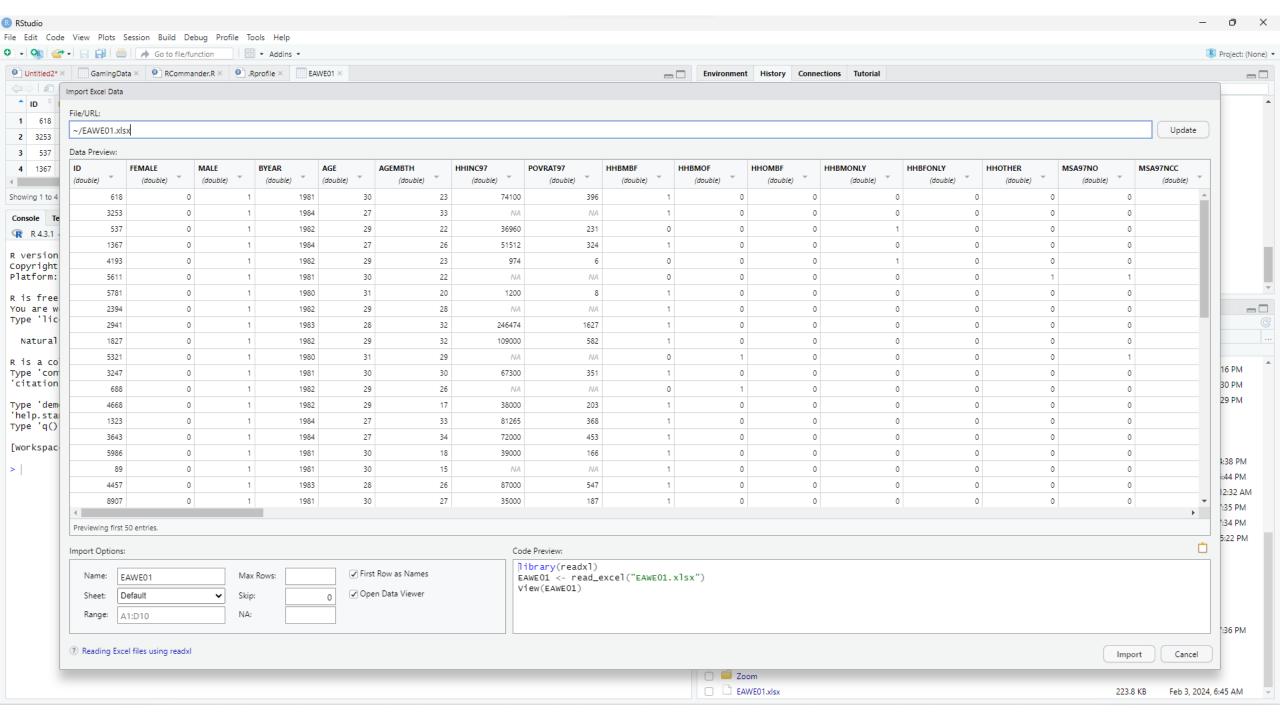
Multiple Linear Regression Analysis

Model Building Flowchart

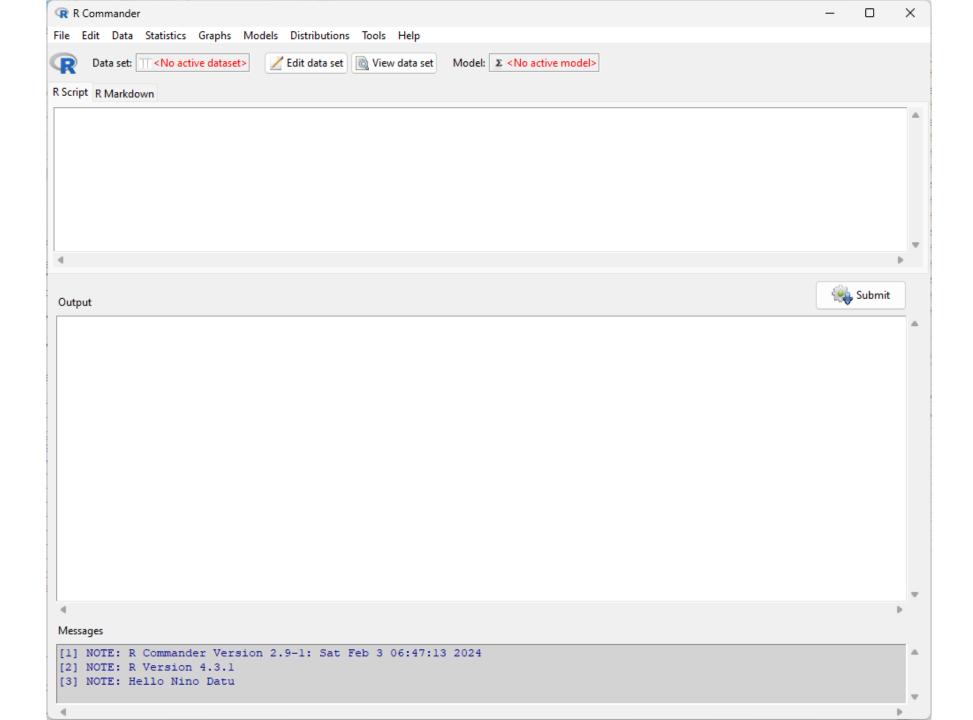


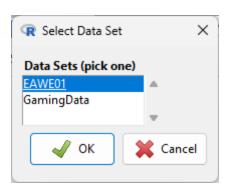
Import file in R Studio



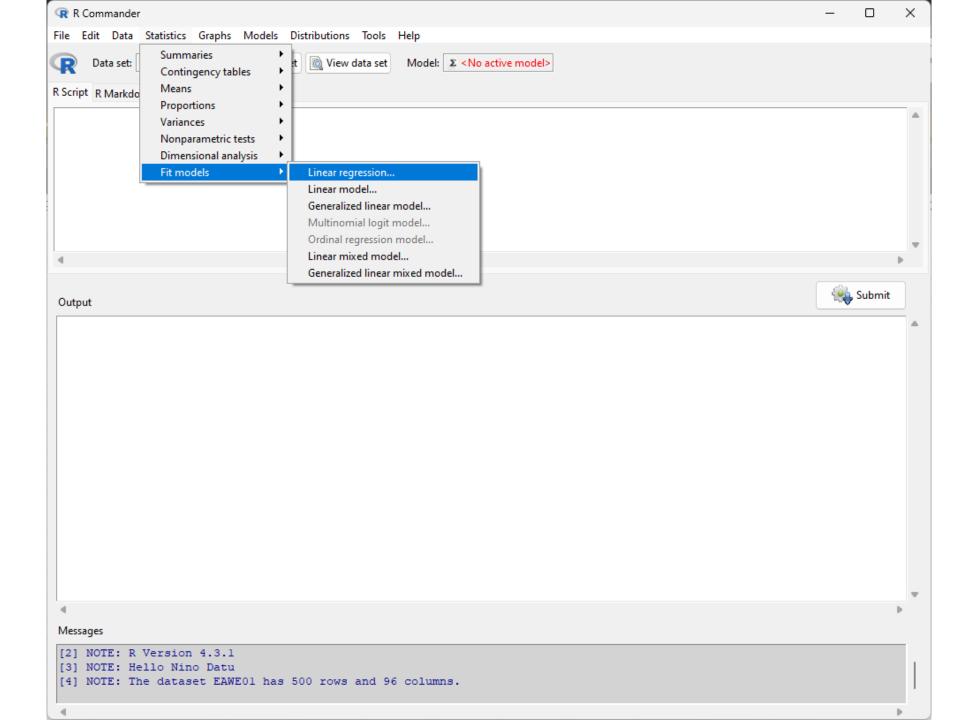


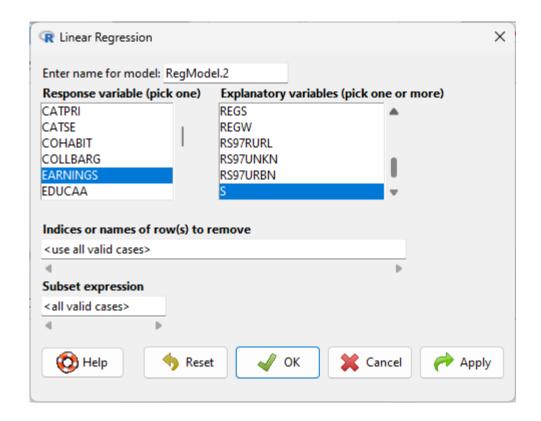
Import file in R Commander

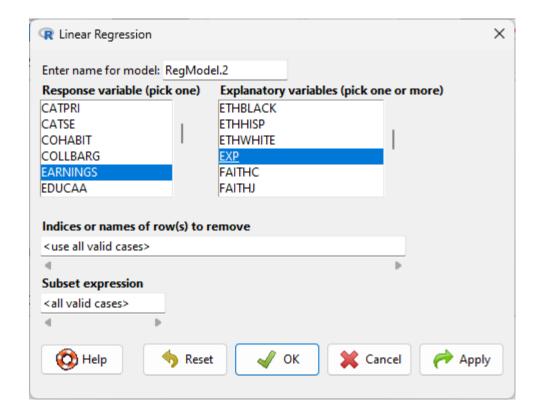




Running the Regression Model

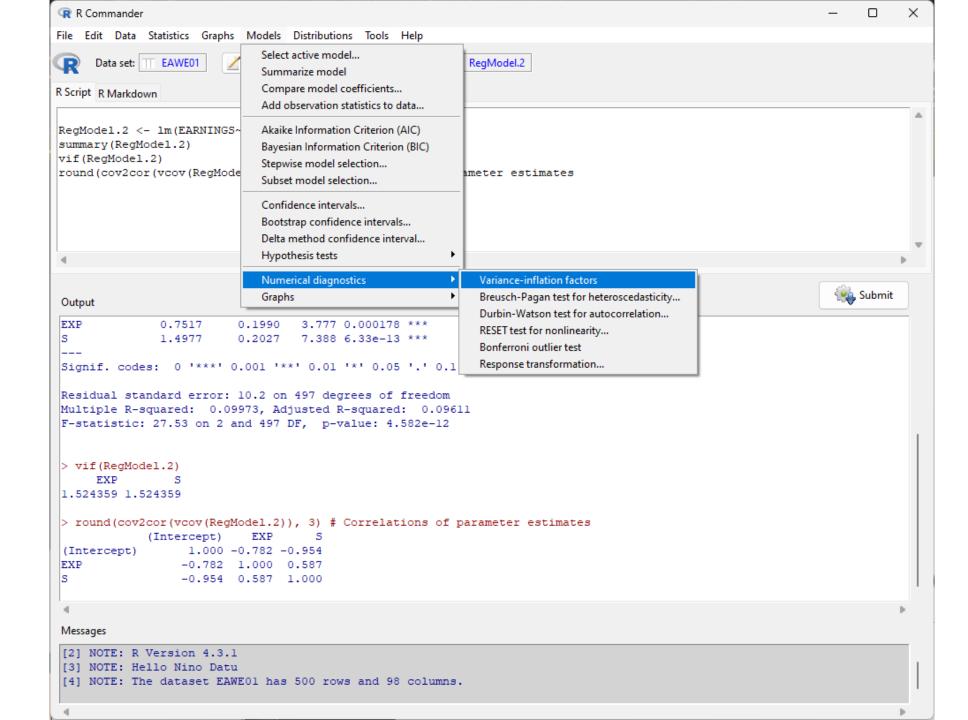






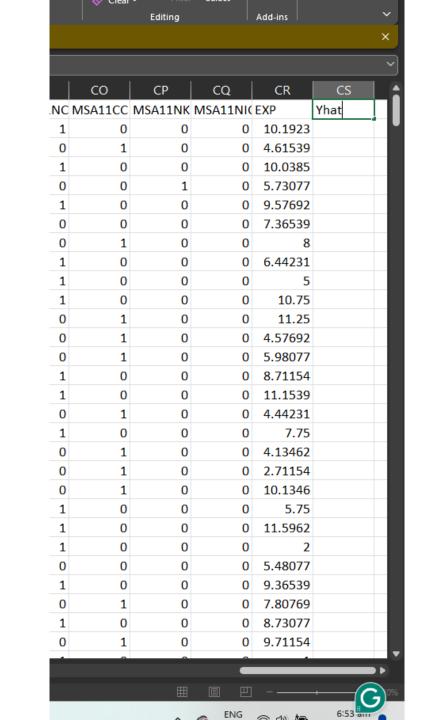
```
- 🗆 X
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
Data set: Π EAWE01 Z Edit data set 🔯 View data set Model: Σ RegModel.2
R Script R Markdown
RegModel.2 <- lm(EARNINGS~EXP+S, data=EAWE01)
summary(RegModel.2)
                                                                                                         Submit 🙀
Output
Call:
lm(formula = EARNINGS ~ EXP + S, data = EAWE01)
Residuals:
  Min 1Q Median 3Q Max
-19.186 -6.264 -1.788 3.429 88.023
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) -8.4500 3.9050 -2.164 0.030947 *
        0.7517 0.1990 3.777 0.000178 ***
           1.4977 0.2027 7.388 6.33e-13 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 10.2 on 497 degrees of freedom
Multiple R-squared: 0.09973, Adjusted R-squared: 0.09611
F-statistic: 27.53 on 2 and 497 DF, p-value: 4.582e-12
Messages
[2] NOTE: R Version 4.3.1
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```

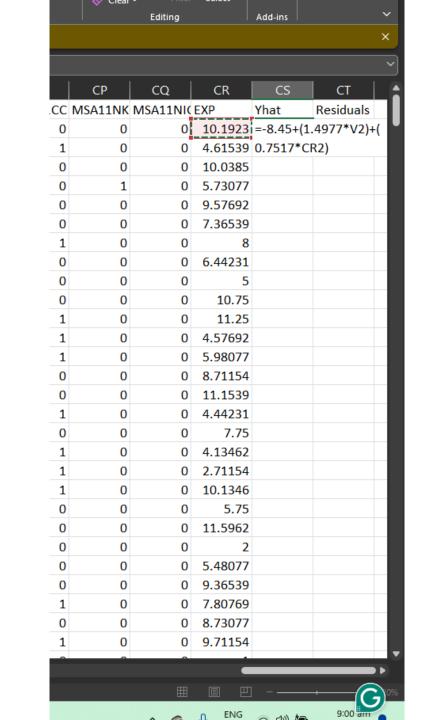
Multicollinearity Test



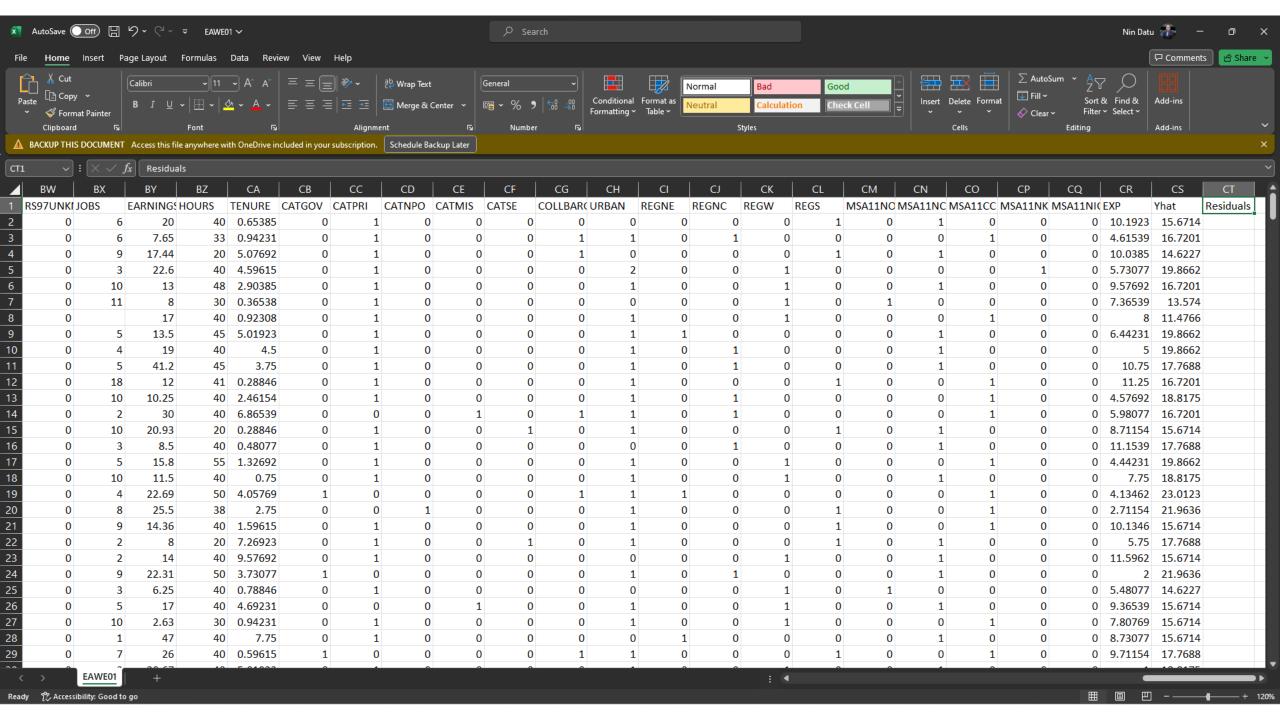
```
- 🗆 X
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
Data set: Π EAWE01 Z Edit data set 🔯 View data set Model: Σ RegModel.2
R Script R Markdown
RegModel.2 <- lm(EARNINGS~EXP+S, data=EAWE01)
summary(RegModel.2)
vif(RegModel.2)
round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
                                                                                                          🐅 Submit
Output
EXP
             0.7517 0.1990 3.777 0.000178 ***
             1.4977
                       0.2027 7.388 6.33e-13 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 10.2 on 497 degrees of freedom
Multiple R-squared: 0.09973, Adjusted R-squared: 0.09611
F-statistic: 27.53 on 2 and 497 DF, p-value: 4.582e-12
> vif(RegModel.2)
    EXP S
1.524359 1.524359
> round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
           (Intercept) EXP S
(Intercept) 1.000 -0.782 -0.954
             -0.782 1.000 0.587
              -0.954 0.587 1.000
Messages
[2] NOTE: R Version 4.3.1
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
```

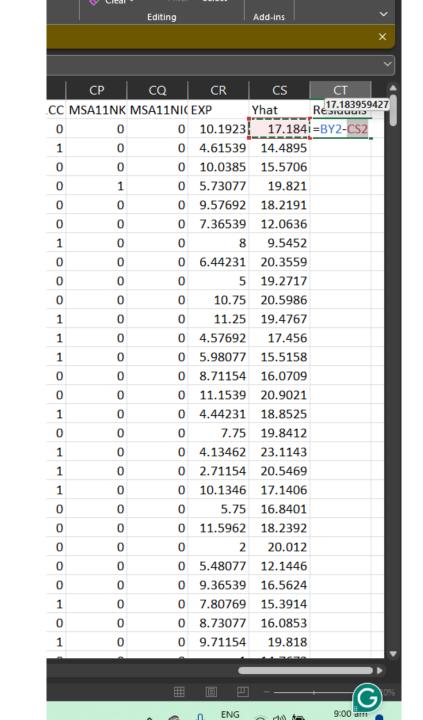
Generate Yhat(Fitted/Predicted values of Y)





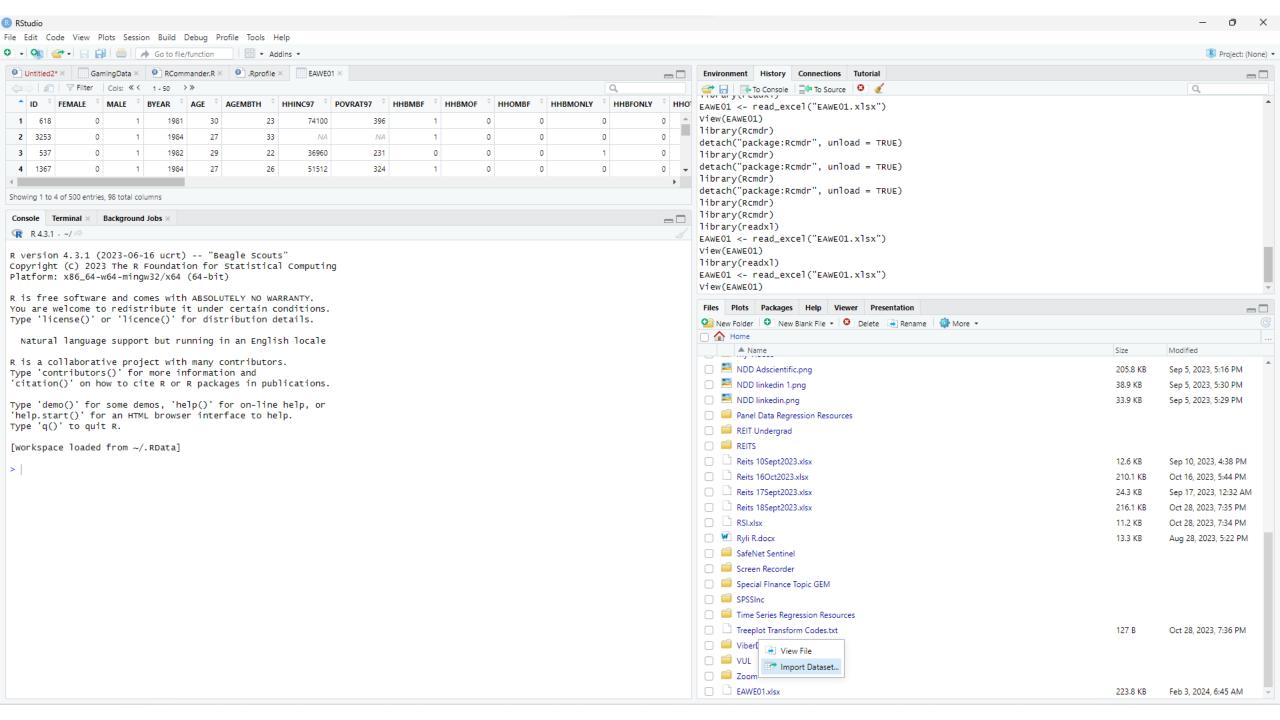
Generate Residuals

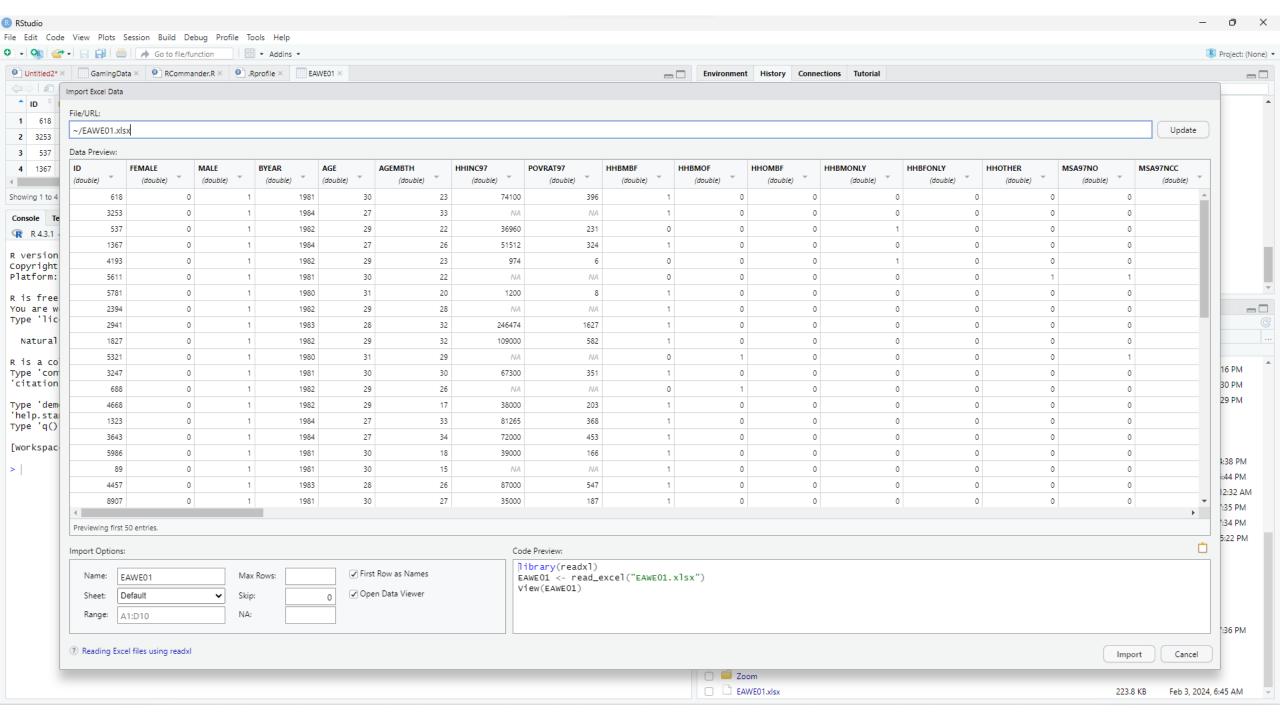




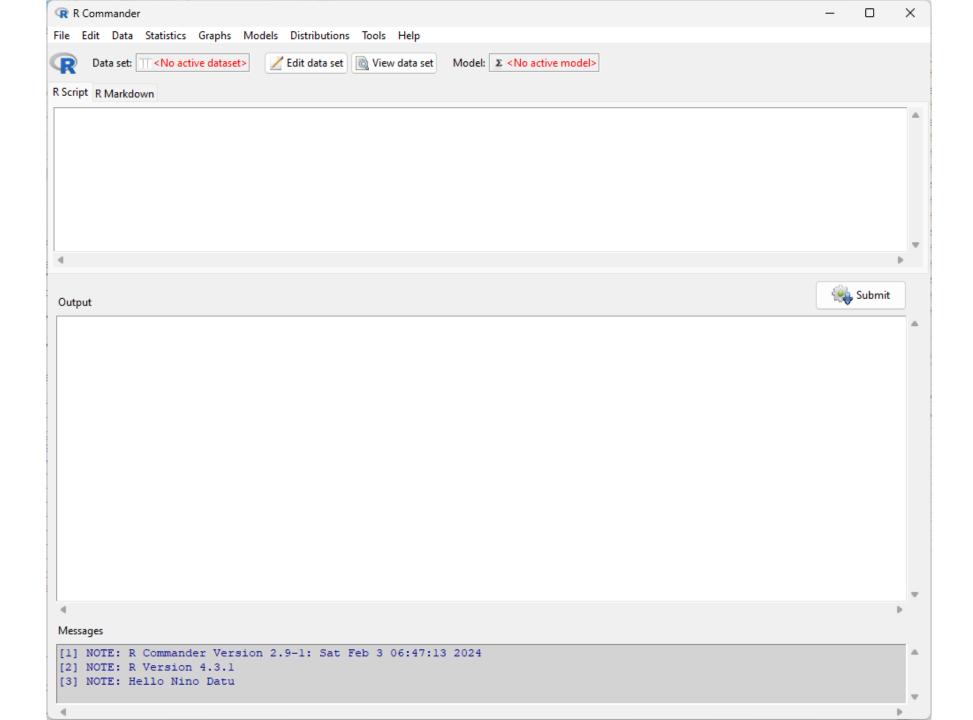
Importing file with residuals

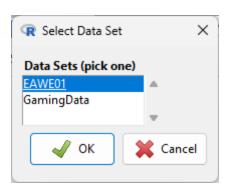
Import file in R Studio





Import file in R Commander



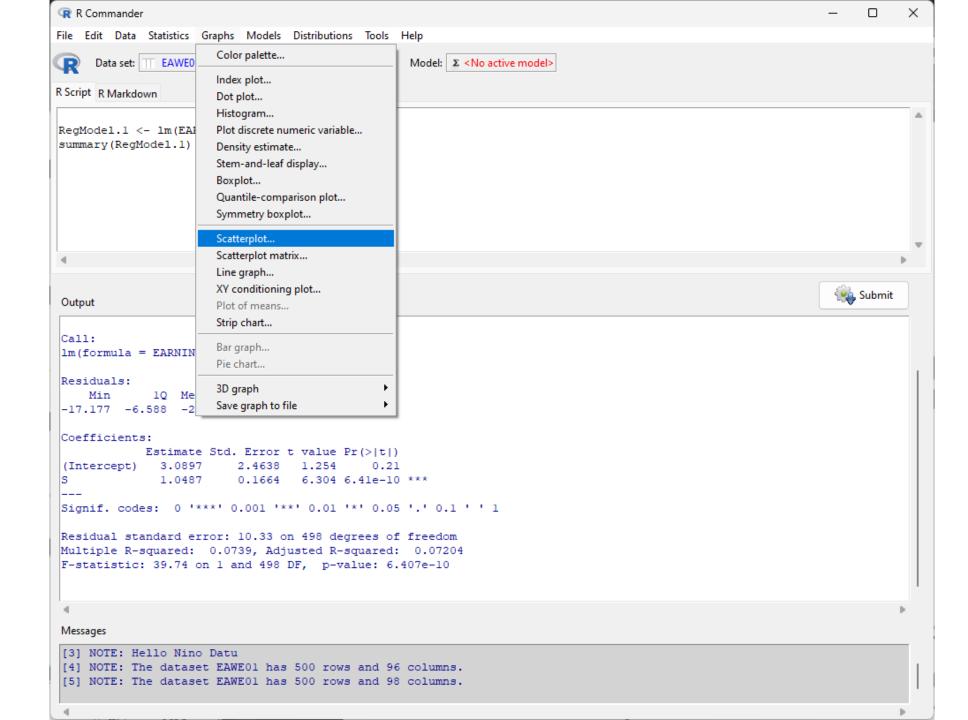


```
R Commander
                                                                                                         - 🗆 X
File Edit Data Statistics Graphs Models Distributions Tools Help
Data set: Π EAWE01 Z Edit data set 🔯 View data set Model: Σ <No active model>
R Script R Markdown
RegModel.1 <- lm(EARNINGS~S, data=EAWE01)
summary(RegModel.1)
                                                                                                          Submit Submit
Output
Call:
lm(formula = EARNINGS ~ S, data = EAWE01)
Residuals:
  Min 1Q Median 3Q Max
-17.177 -6.588 -2.147 3.532 86.424
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) 3.0897 2.4638 1.254 0.21
       1.0487 0.1664 6.304 6.41e-10 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 10.33 on 498 degrees of freedom
Multiple R-squared: 0.0739, Adjusted R-squared: 0.07204
F-statistic: 39.74 on 1 and 498 DF, p-value: 6.407e-10
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 96 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```

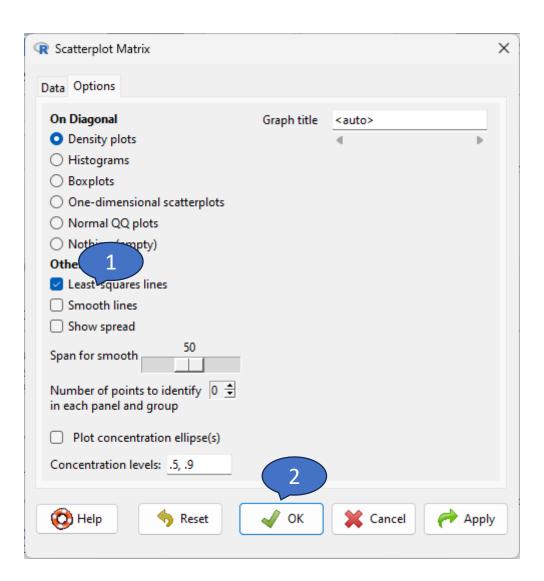
R	EAWE0	1							_	_ >	<
	REGW	REGS	MSA11NO	MSA11NCC	MSA11CC	MSA11NK	MSA11NIC	EXP	Yhat	Residuals	3
1	0	1	0	1	0	0	0	10.1923100	15.6714	4.3286	5
2	0	0	0	0	1	0	0	4.6153850	16.7201	-9.0701	L
2	0	1	0	1	0	0	0	10.0384600	14.6227	2.8173	3
4	1	0	0	0	0	1	0	5.7307690	19.8662	2.7338	3
5	1	0	0	1	0	0	0	9.5769230	16.7201	-3.7201	L
6	1	0	1	0	0	0	0	7.3653850	13.5740	-5.5740)
7	1	0	0	0	1	0	0	8.0000000	11.4766	5.5234	4
8	0	0	0	1	0	0	0	6.4423070	19.8662	-6.3662	2
9	0	0	0	1	0	0	0	5.0000000	19.8662	-0.8662	2
10	0	0	0	1	0	0	0	10.7500000	17.7688	23.4312	2
11	0	1	0	0	1	0	0	11.2500000	16.7201	-4.7201	L
12	0	0	0	0	1	0	0	4.5769230	18.8175	-8.5675	5
13	0	0	0	0	1	0	0	5.9807690	16.7201	13.2799	9
14	0	1	0	1	0	0	0	8.7115380	15.6714	5.2586	5
15	0	0	0	1	0	0	0	11.1538500	17.7688	-9.2688	3
16	1	0	0	0	1	0	0	4.4423070	19.8662	-4.0662	2
17	1	0	0	1	0	0	0	7.7500000	18.8175	-7.3175	5
18	0	0	0	0	1	0	0	4.1346150	23.0123	-0.3223	3
19	0	1	0	0	1	0	0	2.7115390	21.9636	3.5364	1
20	0	1	0	0	1	0	0	10.1346100	15.6714	-1.3114	1
21	0	1	0	1	0	0	0	5.7500000	17.7688	-9.7688	3
22	1	0	0	1	0	0	0	11.5961500	15.6714	-1.6714	1
23	0	0	0	1	0	0	0	2.0000000	21.9636	0.3464	1
24	1	0	1	0	0	0	0	5.4807690	14.6227	-8.3727	7
25	1	0	0	1	0	0	0	9.3653850	15.6714	1.3286	5
26	1	0	0	0	1	0	0	7.8076930	15.6714	-13.0414	1
27	0	0	0	1	0	0	0	8.7307690	15.6714	31.3286	5
28	0	1	0	0	1	0	0	9.7115380	17.7688	8.2312	2
29	1	0	0	1	0	0	0	1.0000000	18.8175	1.8525	5
30	0	0	0	0	1	0	0	9.7115380	18.8175	-16.6875	5 🕶
	1										

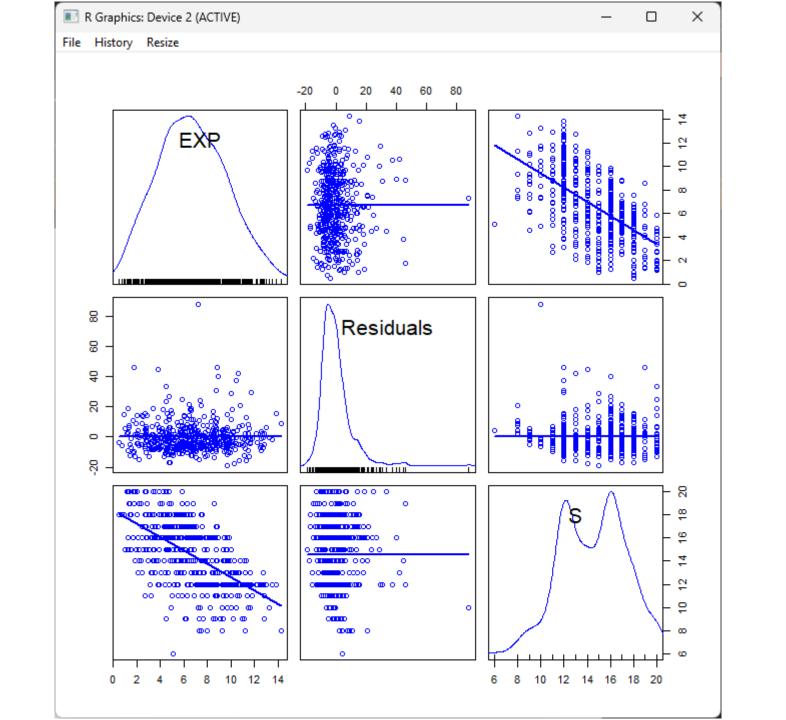
Regression Diagnostics: L. I. N. E.

Diagnostics: Linearity of Residuals

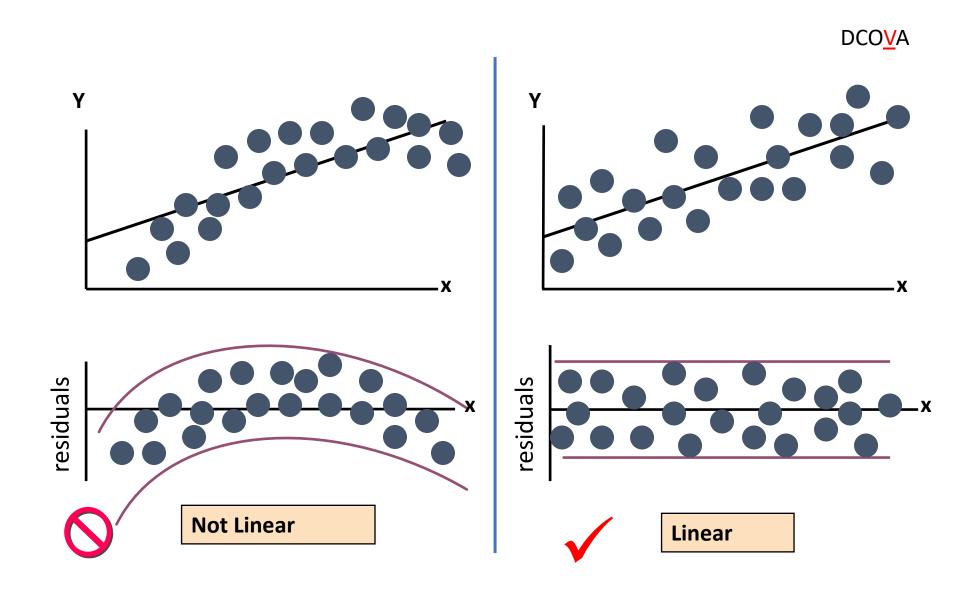








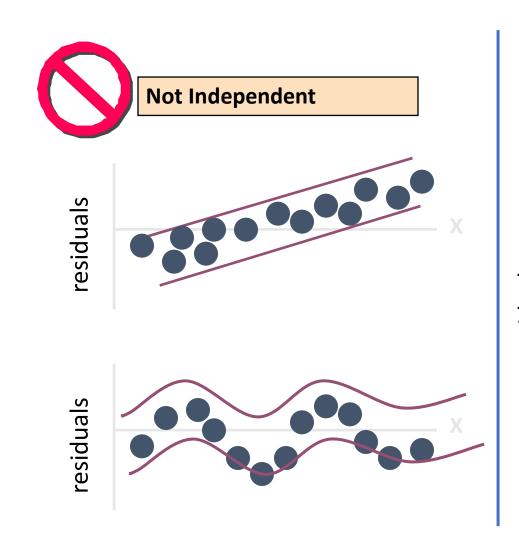
Residual Analysis for Linearity

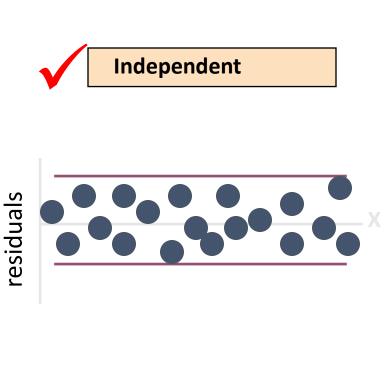


Diagnostics: Independence of Residuals

Residual Analysis for Independence

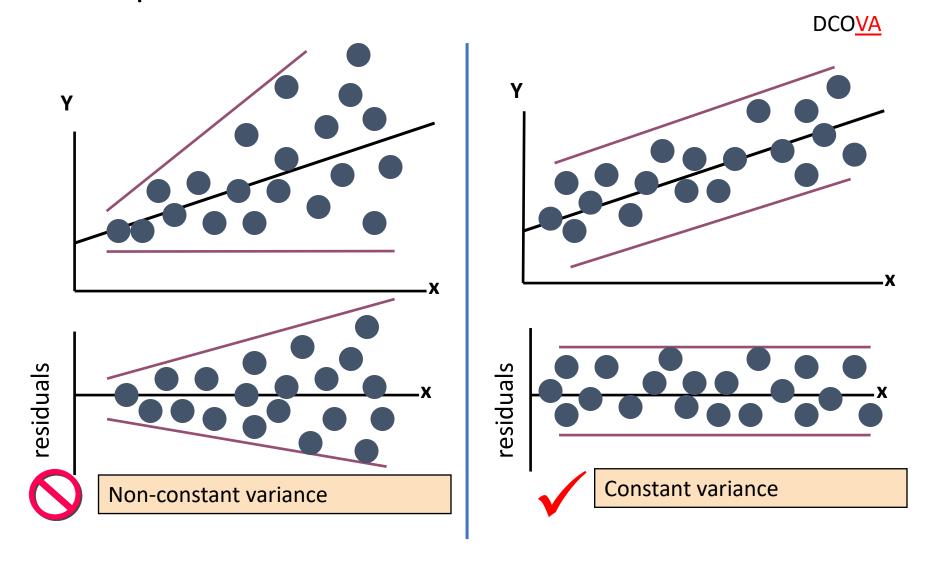




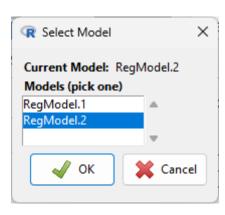


Diagnostics: Equal Variance of Residuals

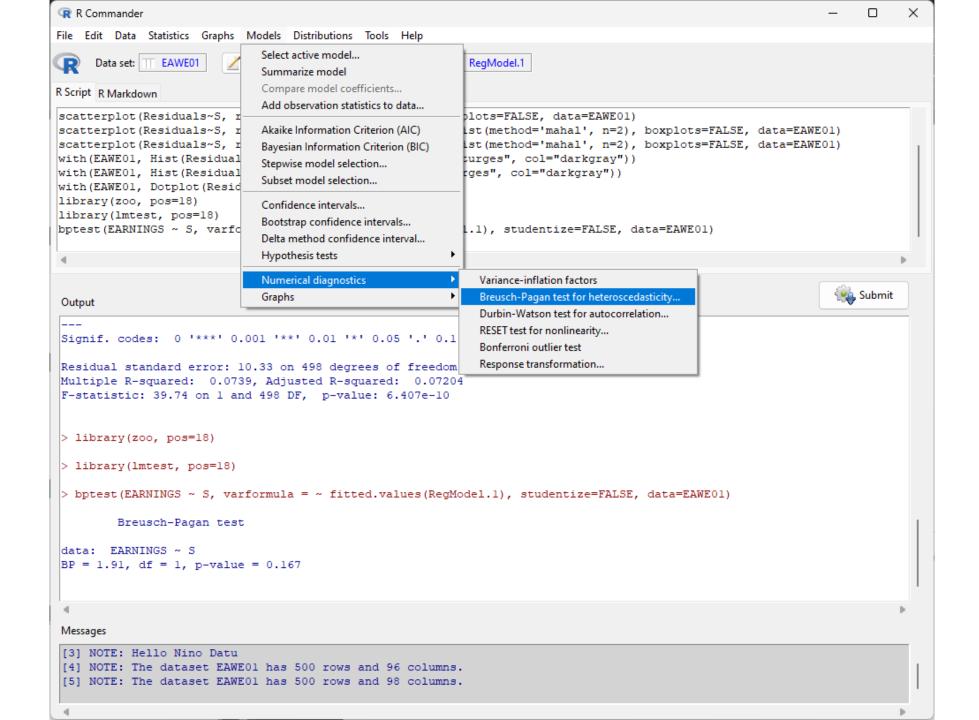
Residual Analysis for Equal Variance

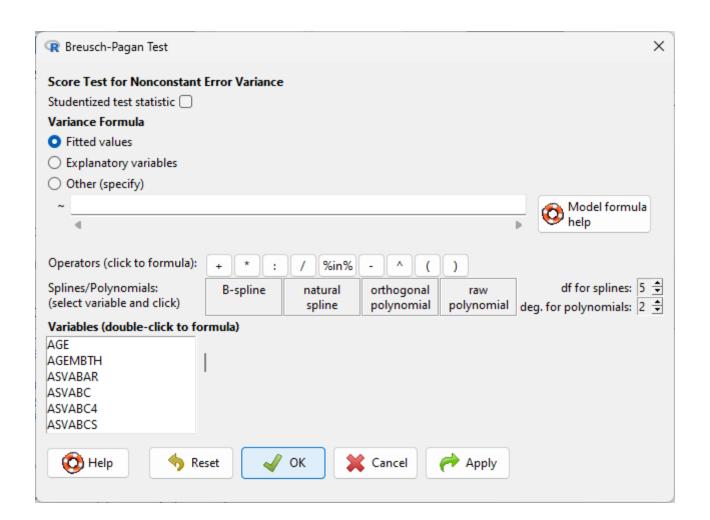


```
R Commander
                                                                                                      - D X
File Edit Data Statistics Graphs Models Distributions Tools Help
    R Script R Markdown
RegModel.1 <- lm(EARNINGS~S, data=EAWE01)
summary(RegModel.1)
scatterplot(Residuals~S, regLine=FALSE, smooth=FALSE, boxplots=FALSE, data=EAWE01)
|scatterplot(Residuals~S, regLine=TRUE, smooth=FALSE, id=list(method='mahal', n=2), boxplots=FALSE, data=EAWE01)
scatterplot(Residuals~S, regLine=TRUE, smooth=FALSE, id=list(method='mahal', n=2), boxplots=FALSE, data=EAWE01)
with (EAWE01, Hist (Residuals, scale="frequency", breaks="Sturges", col="darkgray"))
with (EAWE01, Hist (Residuals, scale="percent", breaks="Sturges", col="darkgray"))
with (EAWE01, Dotplot (Residuals, bin=FALSE))
                                                                                                        Submit Submit
Output
Call:
lm(formula = EARNINGS ~ S, data = EAWE01)
Residuals:
    Min
         1Q Median 3Q Max
-17.177 -6.588 -2.147 3.532 86.424
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) 3.0897 2.4638 1.254 0.21
             1.0487 0.1664 6.304 6.41e-10 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 10.33 on 498 degrees of freedom
Multiple R-squared: 0.0739, Adjusted R-squared: 0.07204
F-statistic: 39.74 on 1 and 498 DF, p-value: 6.407e-10
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 96 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```



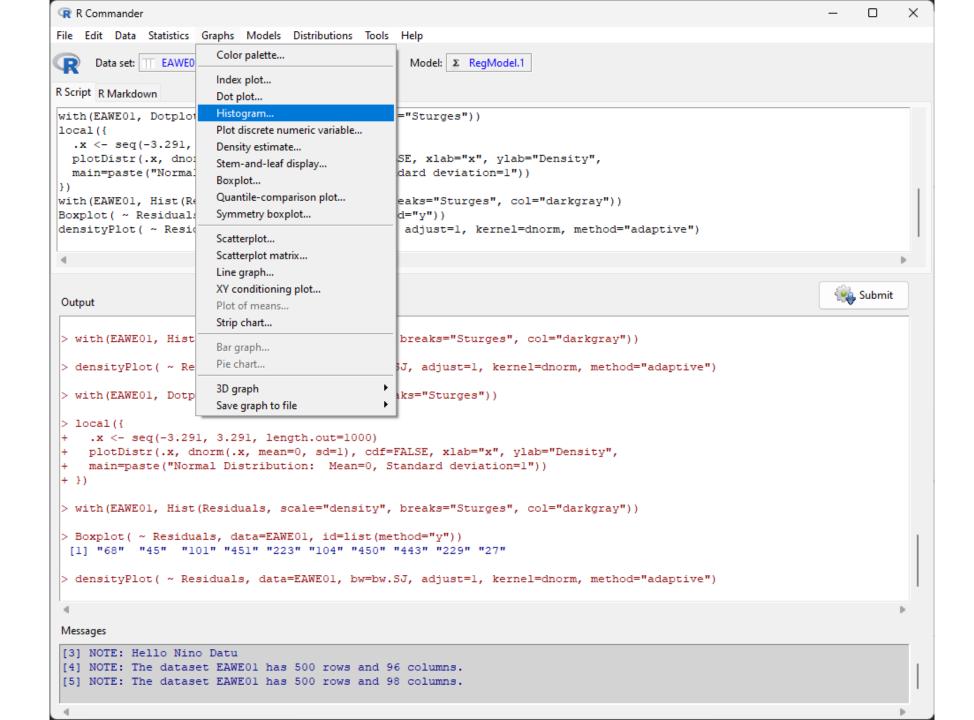
```
R Commander
                                                                                                               File Edit Data Statistics Graphs Models Distributions Tools Help
     Data set: TEAWE01 / Edit data set View data set Model: EREGModel.2
R Script R Markdown
RegModel.2 <- lm(EARNINGS~EXP+S, data=EAWE01)
summary(RegModel.2)
vif(RegModel.2)
round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
                                                                                                             Submit 💨
Output
Residual standard error: 10.2 on 497 degrees of freedom
Multiple R-squared: 0.09973, Adjusted R-squared: 0.09611
F-statistic: 27.53 on 2 and 497 DF, p-value: 4.582e-12
> vif(RegModel.2)
     EXP
1.524359 1.524359
> round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
           (Intercept) EXP S
 (Intercept) 1.000 -0.782 -0.954
EXP
               -0.782 1.000 0.587
              -0.954 0.587 1.000
> scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
> scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```

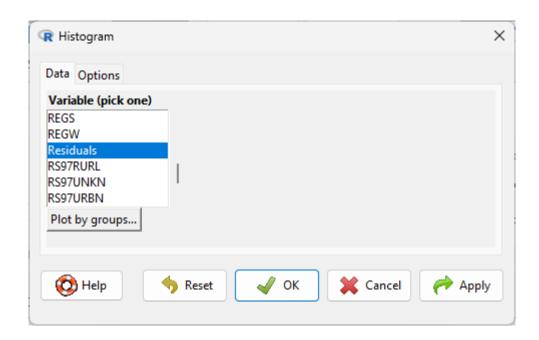


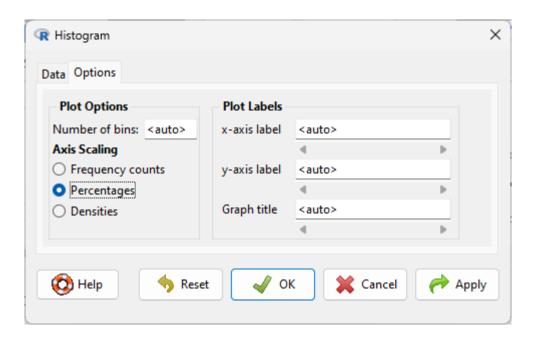


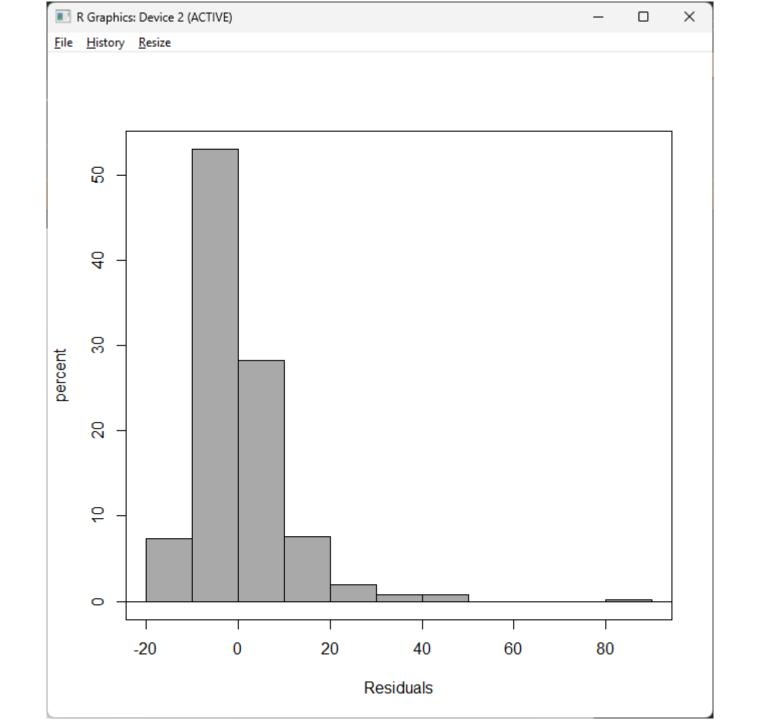
```
R Commander
                                                                                                        _ _
File Edit Data Statistics Graphs Models Distributions Tools Help
     R Script R Markdown
RegModel.2 <- lm(EARNINGS~EXP+S, data=EAWE01)
summary(RegModel.2)
vif(RegModel.2)
round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
|scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.2), studentize=FALSE, data=EAWE01)
                                                                                                         Submit Submit
Output
1.524359 1.524359
> round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
            (Intercept) EXP S
(Intercept) 1.000 -0.782 -0.954
EXP
               -0.782 1.000 0.587
              -0.954 0.587 1.000
> scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
> scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
> bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.2), studentize=FALSE, data=EAWE01)
        Breusch-Pagan test
data: EARNINGS ~ EXP + S
BP = 1.2703, df = 1, p-value = 0.2597
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```

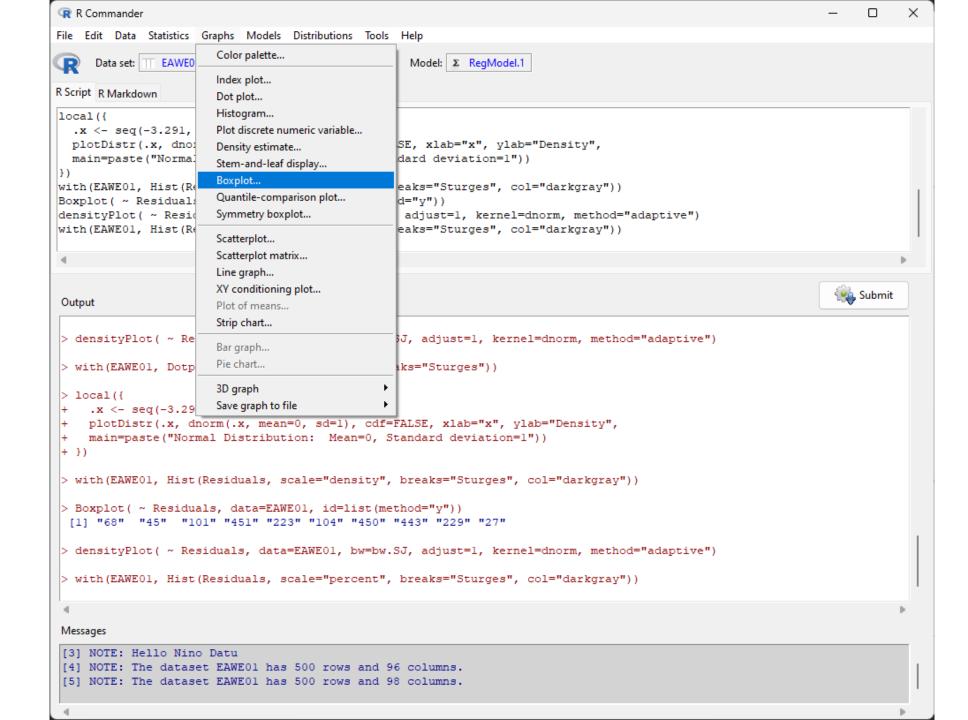
Diagnostics: Normality of Residuals

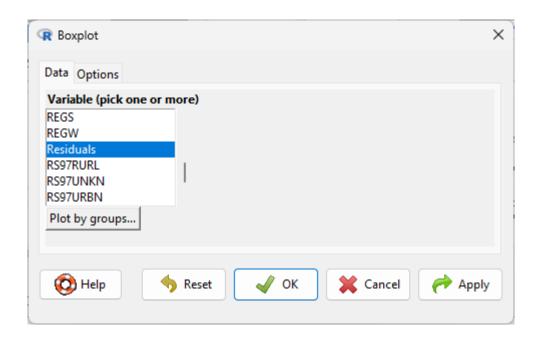


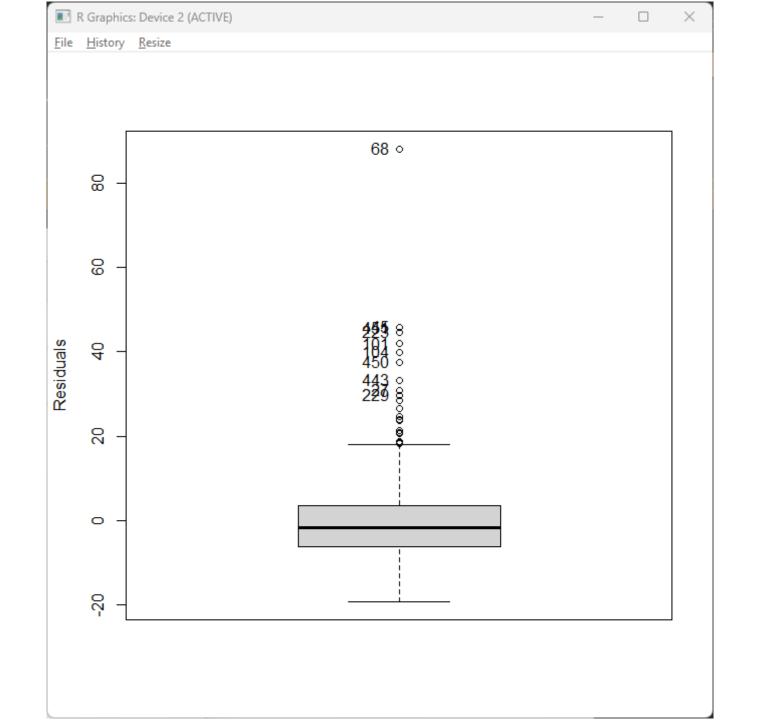


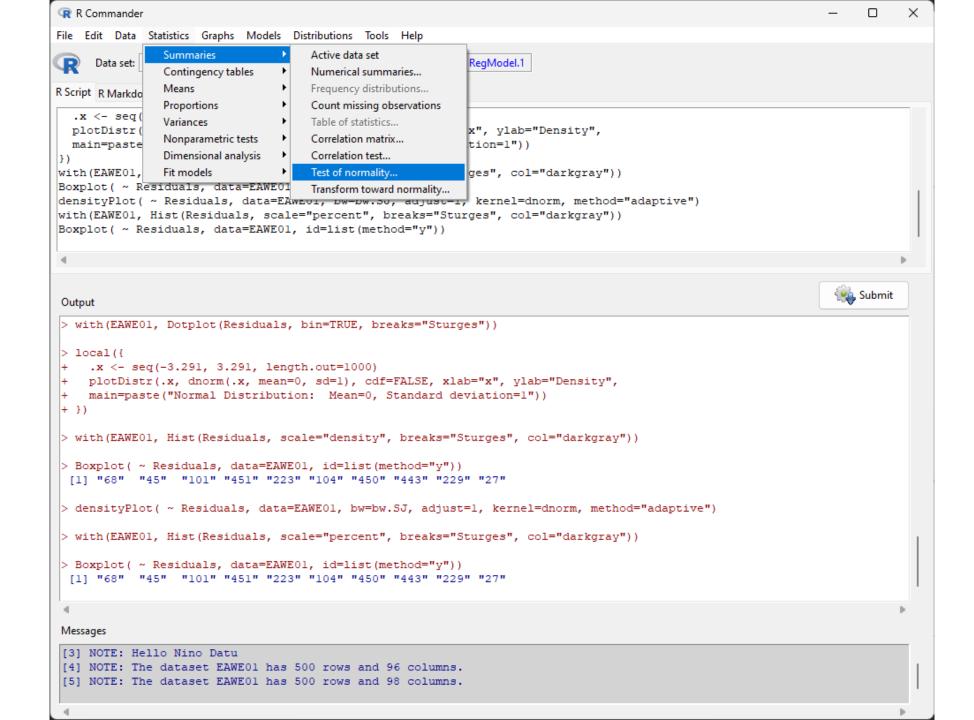


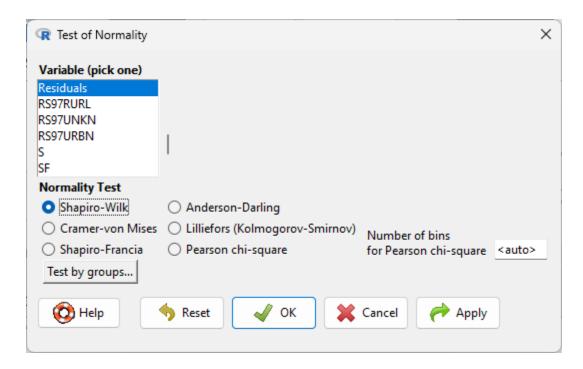








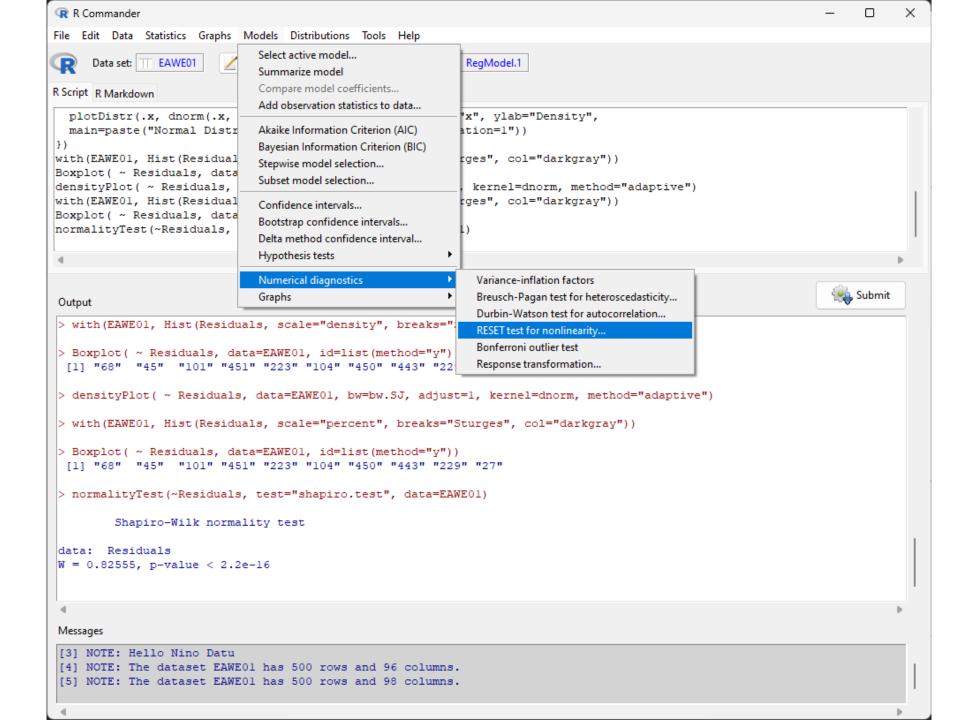


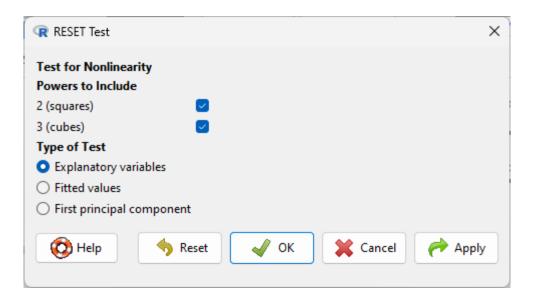


```
R Commander
                                                                                                         _ _
File Edit Data Statistics Graphs Models Distributions Tools Help
    R Script R Markdown
summary(RegModel.2)
vif(RegModel.2)
round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.2), studentize=FALSE, data=EAWE01)
with (EAWEO1, Hist (Residuals, scale="percent", breaks="Sturges", col="darkgray"))
Boxplot( ~ Residuals, data=EAWE01, id=list(method="y"))
normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
                                                                                                          Submit
Output
        Breusch-Pagan test
data: EARNINGS ~ EXP + S
BP = 1.2703, df = 1, p-value = 0.2597
> with(EAWE01, Hist(Residuals, scale="percent", breaks="Sturges", col="darkgray"))
> Boxplot( ~ Residuals, data=EAWE01, id=list(method="y"))
 [1] "68" "45" "451" "223" "101" "104" "450" "443" "27" "229"
> normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
        Shapiro-Wilk normality test
data: Residuals
W = 0.82109, p-value < 2.2e-16
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
[5] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
```

Are there any Omitted Variables?

```
- 🗆 X
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
R Script R Markdown
RegModel.1 <- lm(EARNINGS~S, data=EAWE01)
summary(RegModel.1)
                                                                                                 Submit Submit
Output
Call:
lm(formula = EARNINGS ~ S, data = EAWE01)
Residuals:
  Min 1Q Median 3Q Max
-17.177 -6.588 -2.147 3.532 86.424
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
(Intercept) 3.0897 2.4638 1.254 0.21
      1.0487 0.1664 6.304 6.41e-10 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 10.33 on 498 degrees of freedom
Multiple R-squared: 0.0739, Adjusted R-squared: 0.07204
F-statistic: 39.74 on 1 and 498 DF, p-value: 6.407e-10
Messages
[2] NOTE: R Version 4.3.1
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 96 columns.
```

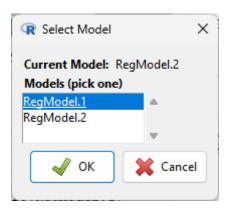


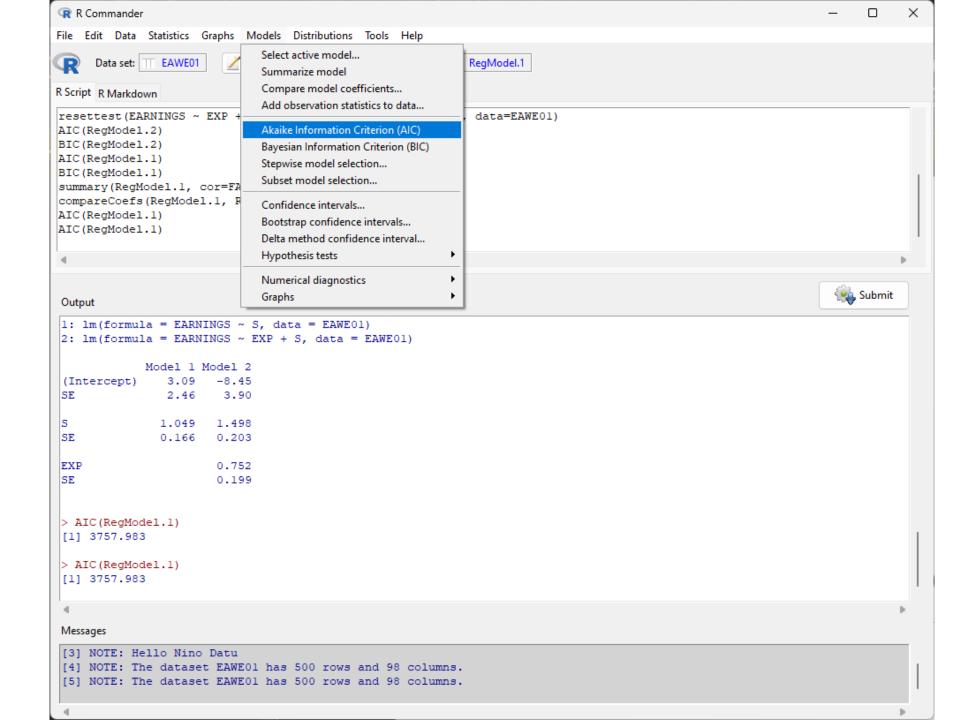


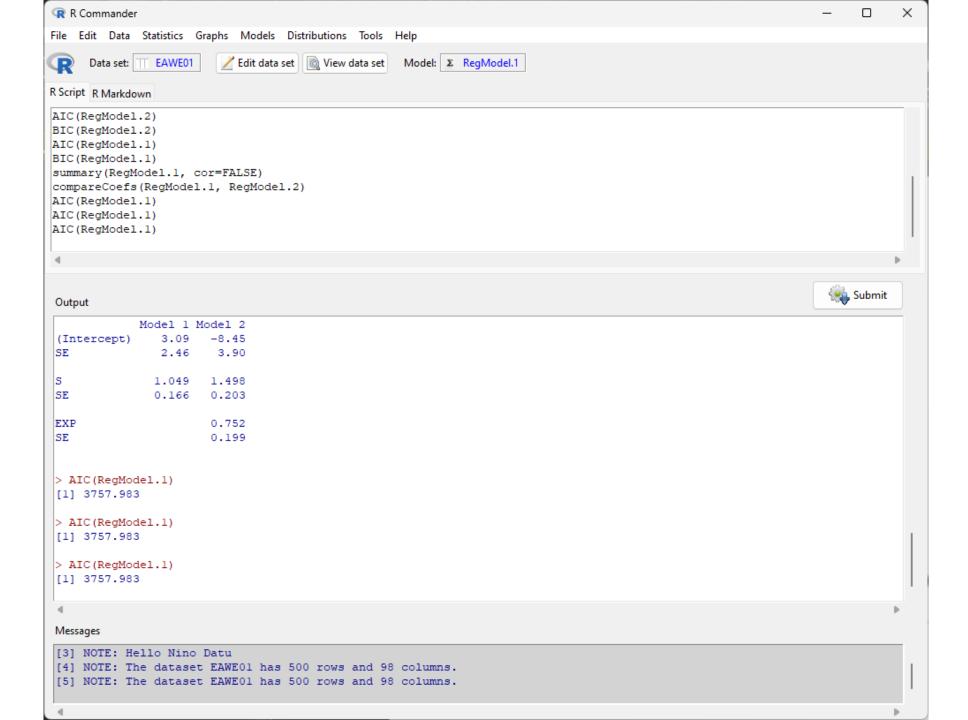
```
R Commander
                                                                                                         _ _
File Edit Data Statistics Graphs Models Distributions Tools Help
     R Script R Markdown
vif(RegModel.2)
round(cov2cor(vcov(RegModel.2)), 3) # Correlations of parameter estimates
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
scatterplotMatrix(~EXP+Residuals+S, regLine=TRUE, smooth=FALSE, diagonal=list(method="density"), data=EAWE01)
bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.2), studentize=FALSE, data=EAWE01)
with (EAWE01, Hist (Residuals, scale="percent", breaks="Sturges", col="darkgray"))
Boxplot( ~ Residuals, data=EAWE01, id=list(method="v"))
normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
resettest (EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
                                                                                                           🐅 Submit
Output
> Boxplot( ~ Residuals, data=EAWE01, id=list(method="y"))
 [1] "68" "45" "451" "223" "101" "104" "450" "443" "27" "229"
> normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
        Shapiro-Wilk normality test
data: Residuals
W = 0.82109, p-value < 2.2e-16
> resettest(EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
        RESET test
data: EARNINGS ~ EXP + S
RESET = 1.7514, df1 = 4, df2 = 493, p-value = 0.1375
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```

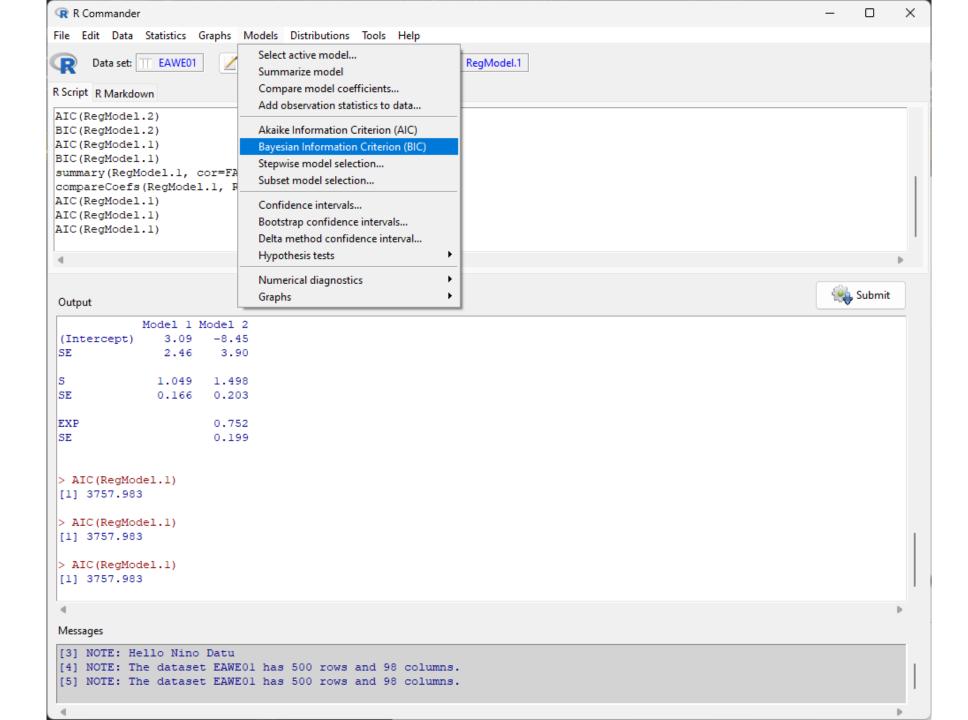
Which is model is better?

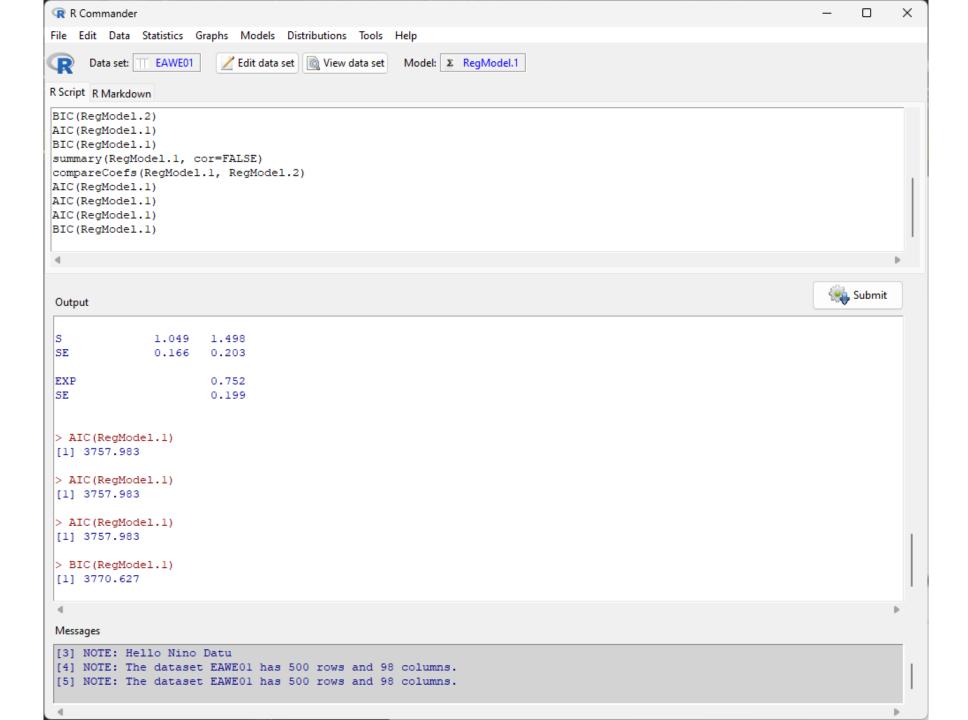
```
_ _
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
     R Script R Markdown
bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.2), studentize=FALSE, data=EAWE01)
with (EAWE01, Hist (Residuals, scale="percent", breaks="Sturges", col="darkgray"))
Boxplot( ~ Residuals, data=EAWE01, id=list(method="y"))
normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
resettest (EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
AIC(RegModel.2)
BIC(RegModel.2)
AIC(RegModel.1)
BIC(RegModel.1)
                                                                                                          Submit Submit
Output
> resettest(EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
        RESET test
data: EARNINGS ~ EXP + S
RESET = 1.7514, dfl = 4, df2 = 493, p-value = 0.1375
> AIC(RegModel.2)
[1] 3745.835
> BIC(RegMode1.2)
[11 3762.694
> AIC(RegModel.1)
[1] 3757.983
> BIC(RegModel.1)
[1] 3770.627
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```



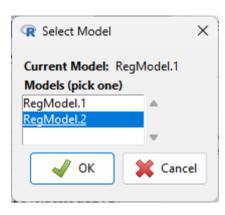


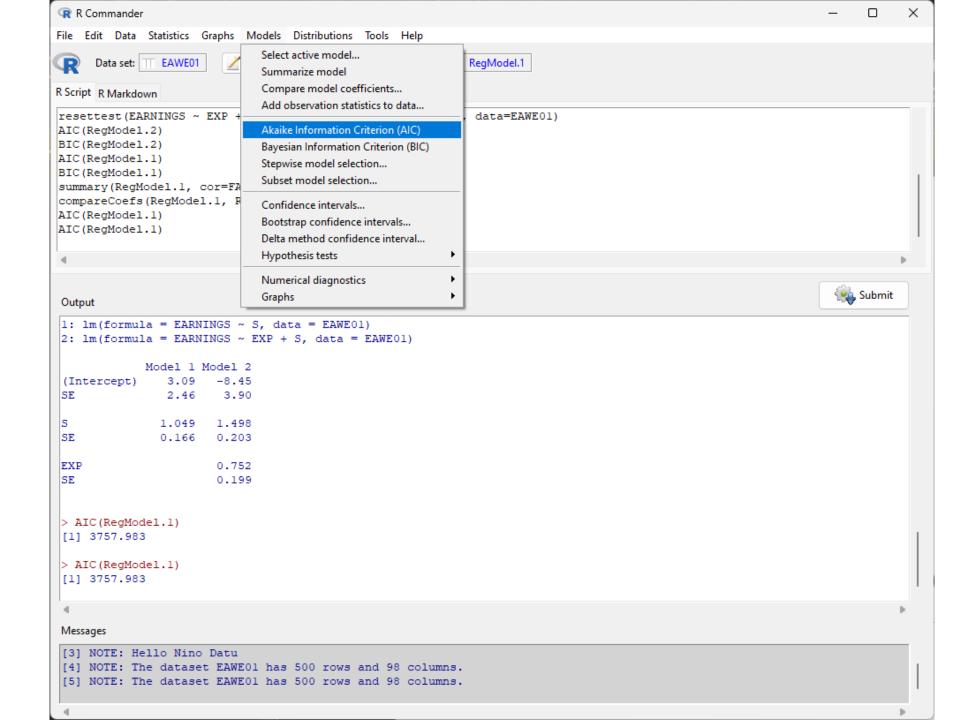


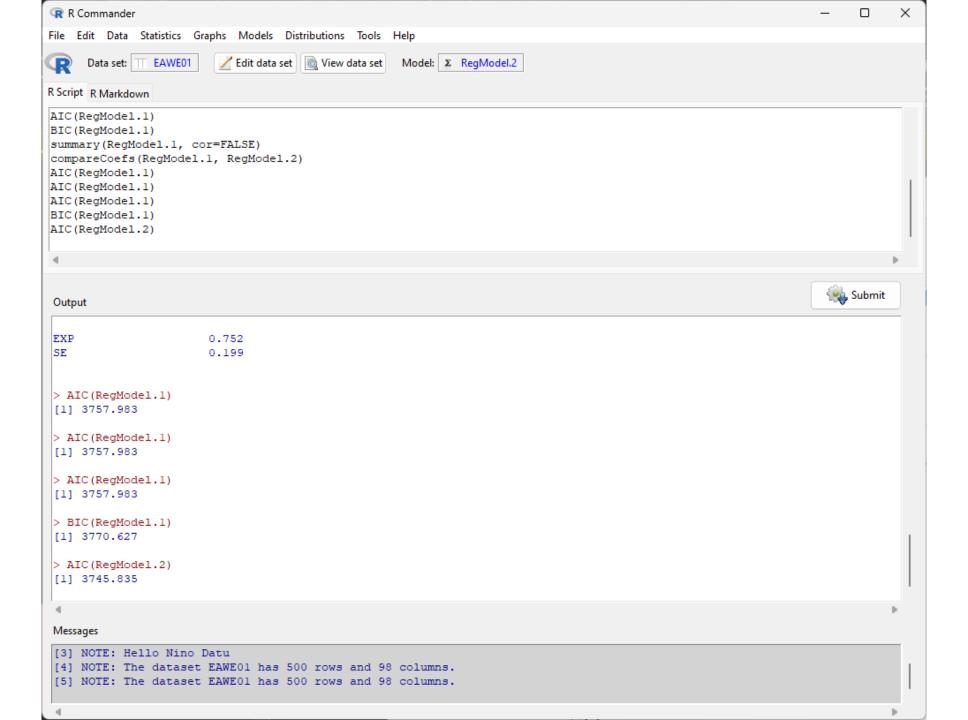


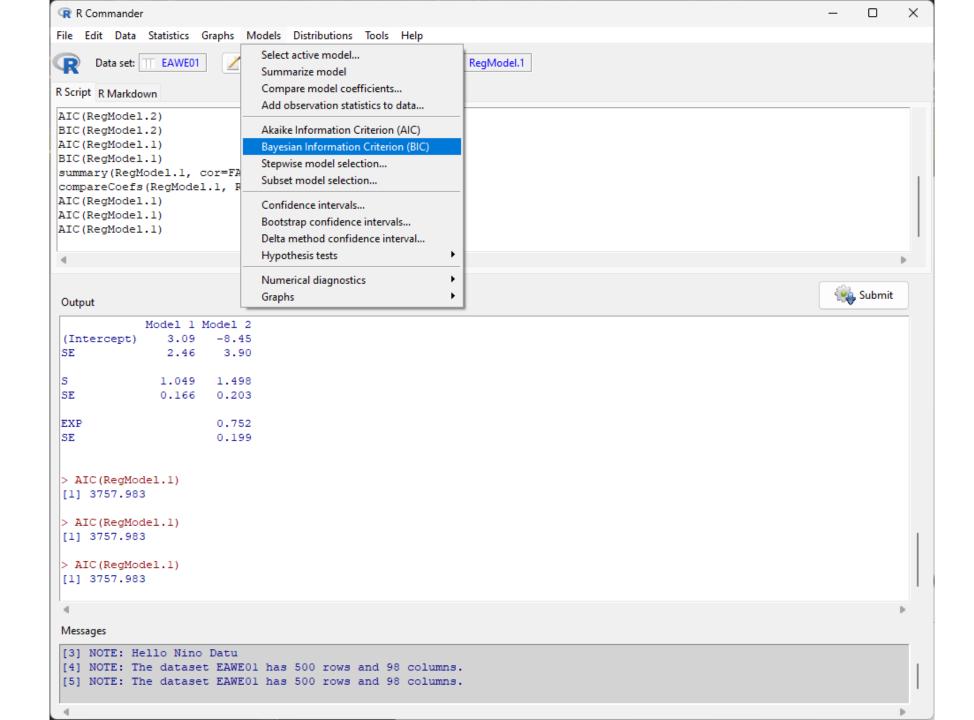


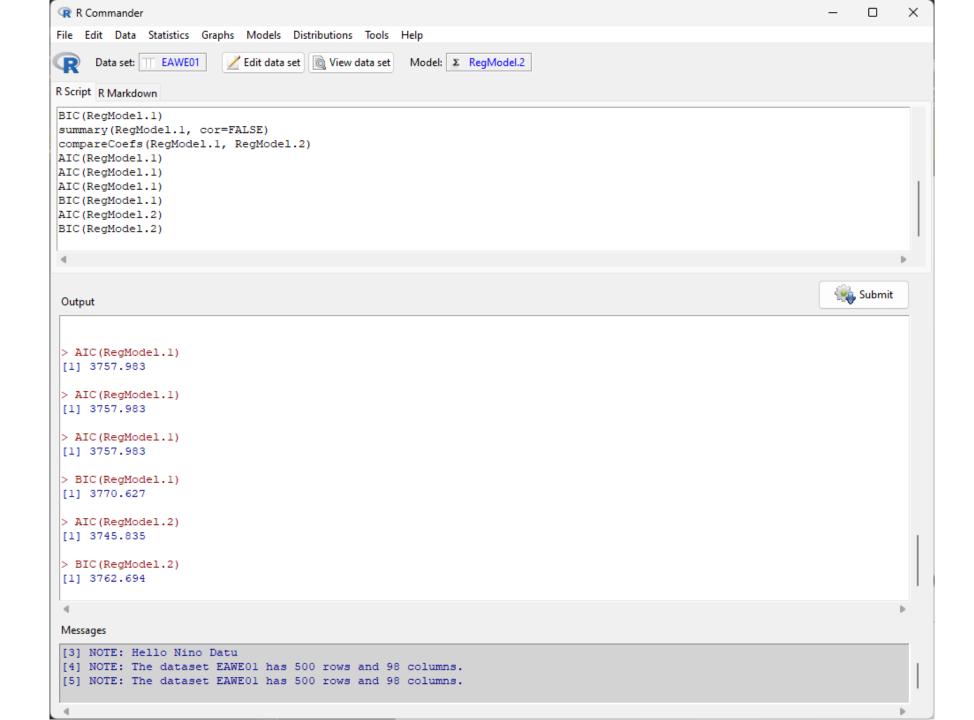
```
_ _
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
     R Script R Markdown
bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.2), studentize=FALSE, data=EAWE01)
with (EAWE01, Hist (Residuals, scale="percent", breaks="Sturges", col="darkgray"))
Boxplot( ~ Residuals, data=EAWE01, id=list(method="y"))
normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
resettest (EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
AIC(RegModel.2)
BIC(RegModel.2)
AIC(RegModel.1)
BIC(RegModel.1)
                                                                                                          Submit Submit
Output
> resettest(EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
        RESET test
data: EARNINGS ~ EXP + S
RESET = 1.7514, dfl = 4, df2 = 493, p-value = 0.1375
> AIC(RegModel.2)
[1] 3745.835
> BIC(RegMode1.2)
[11 3762.694
> AIC(RegModel.1)
[1] 3757.983
> BIC(RegModel.1)
[1] 3770.627
Messages
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWE01 has 500 rows and 98 columns.
[5] NOTE: The dataset EAWEO1 has 500 rows and 98 columns.
```



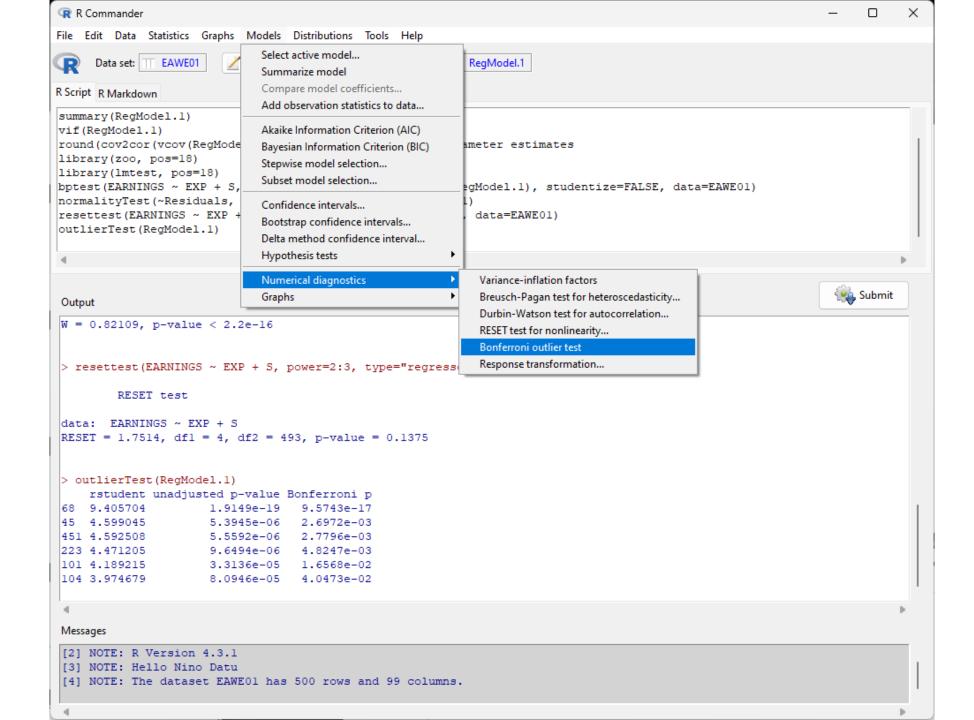






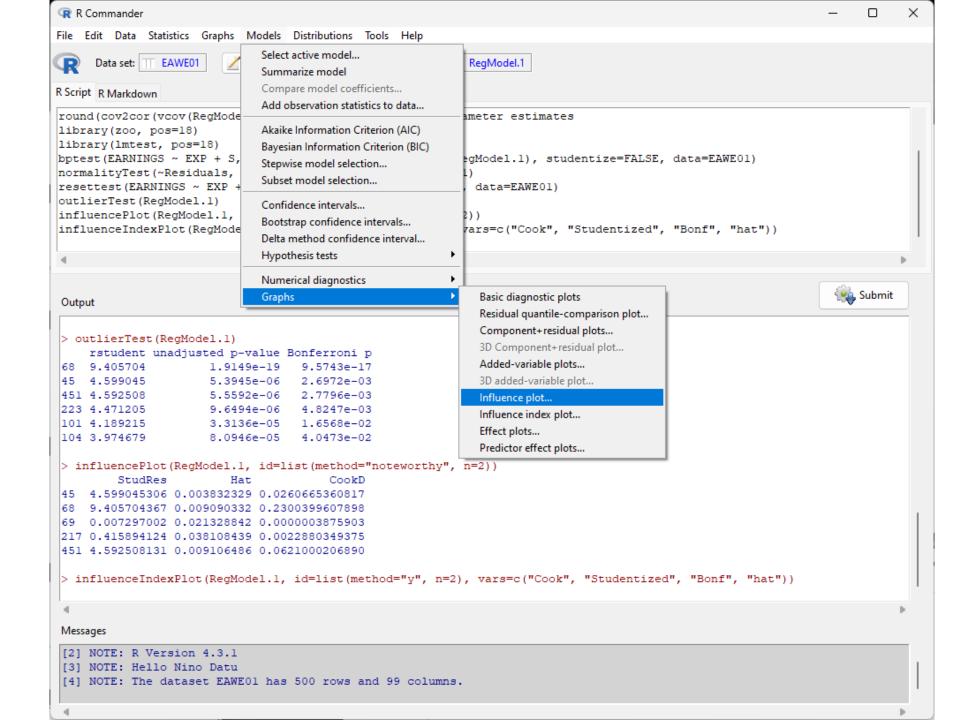


Detecting outlier

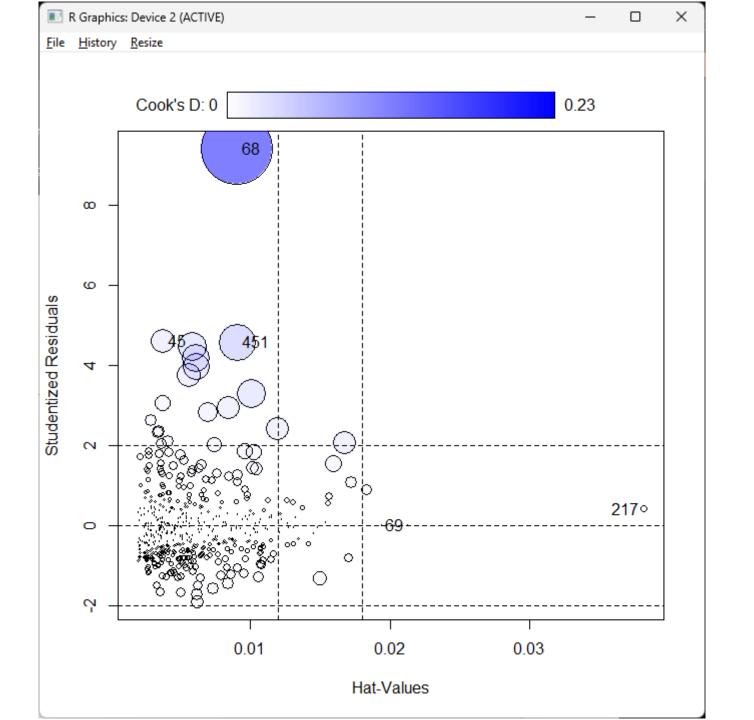


```
- D X
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
    R Script R Markdown
summary(RegModel.1)
vif(RegModel.1)
round(cov2cor(vcov(RegModel.1)), 3) # Correlations of parameter estimates
library(zoo, pos=18)
library(lmtest, pos=18)
bptest(EARNINGS ~ EXP + S, varformula = ~ fitted.values(RegModel.1), studentize=FALSE, data=EAWE01)
normalityTest(~Residuals, test="shapiro.test", data=EAWE01)
resettest(EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
outlierTest(RegModel.1)
                                                                                                            Submit Submit
Output
W = 0.82109, p-value < 2.2e-16
> resettest(EARNINGS ~ EXP + S, power=2:3, type="regressor", data=EAWE01)
        RESET test
data: EARNINGS ~ EXP + S
RESET = 1.7514, dfl = 4, df2 = 493, p-value = 0.1375
> outlierTest(RegModel.1)
  rstudent unadjusted p-value Bonferroni p
68 9.405704 1.9149e-19 9.5743e-17
45 4.599045 5.3945e-06 2.6972e-03
451 4.592508 5.5592e-06 2.7796e-03
223 4.471205 9.6494e-06 4.8247e-03
101 4.189215 3.3136e-05 1.6568e-02
104 3.974679 8.0946e-05 4.0473e-02
Messages
[2] NOTE: R Version 4.3.1
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWEO1 has 500 rows and 99 columns.
```

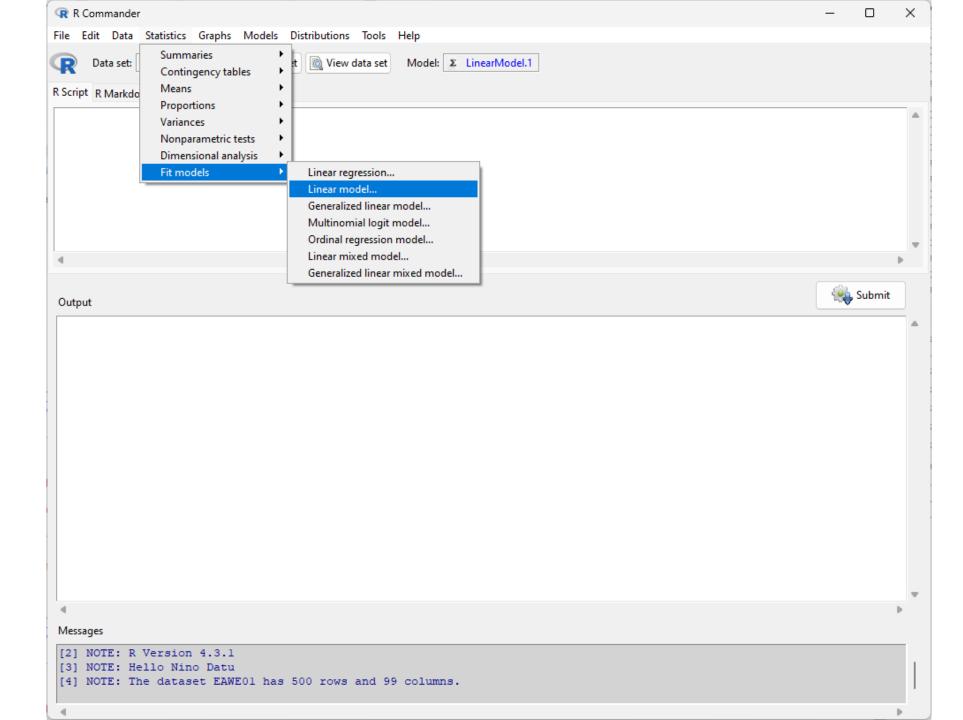
Detecting Influential data

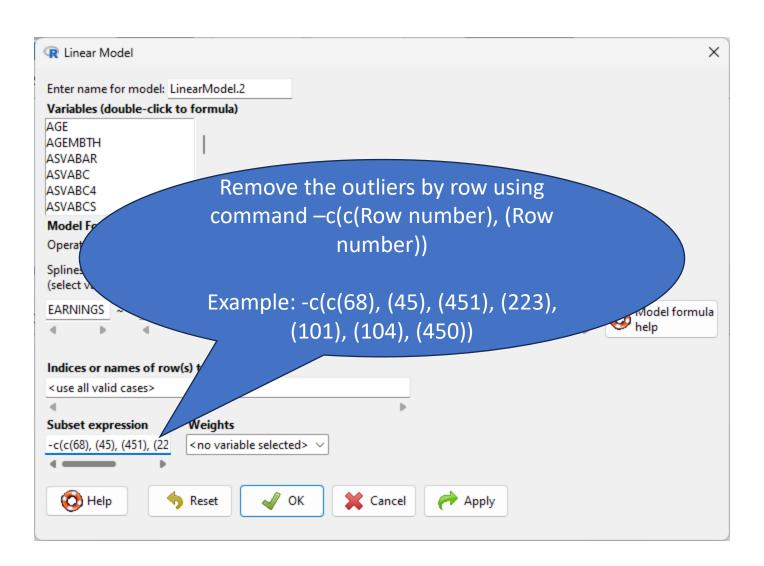






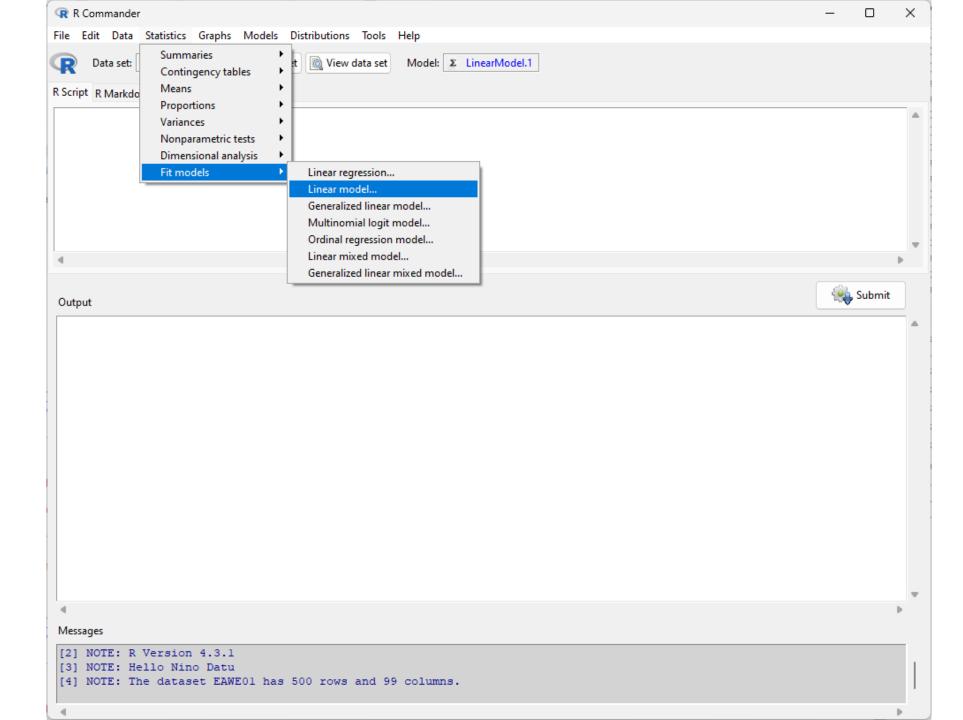
Removing Outliers in the Regression Model





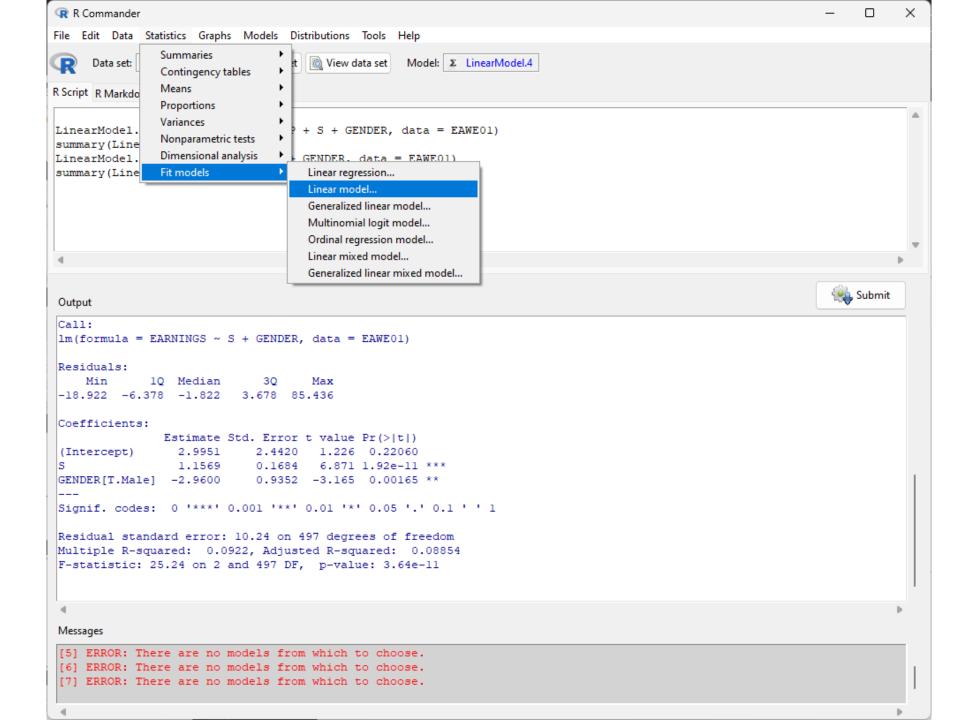
```
R Commander
                                                                                                      - D X
File Edit Data Statistics Graphs Models Distributions Tools Help
    Data set: EAWE01 / Edit data set View data set Model: LinearModel.2
R Script R Markdown
LinearModel.2 < -lin(EARNINGS \sim EXP + S, data = EAWE01, subset = -c(c(68), (45), (451), (223), (101), (104), (450))
summary(LinearModel.2)
                                                                                                      Submit 🙀
Output
lm(formula = EARNINGS ~ EXP + S, data = EAWE01, subset = -c(c(68),
   (45), (451), (223), (101), (104), (450)))
Residuals:
   Min 1Q Median 3Q Max
-18.624 -5.583 -1.119 3.844 33.315
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) -11.2372 3.1512 -3.566 0.000398 ***
EXP
           1.6298 0.1635 9.967 < 2e-16 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 8.167 on 490 degrees of freedom
Multiple R-squared: 0.1707, Adjusted R-squared: 0.1674
F-statistic: 50.45 on 2 and 490 DF, p-value: < 2.2e-16
Messages
[2] NOTE: R Version 4.3.1
[3] NOTE: Hello Nino Datu
[4] NOTE: The dataset EAWEO1 has 500 rows and 99 columns.
```

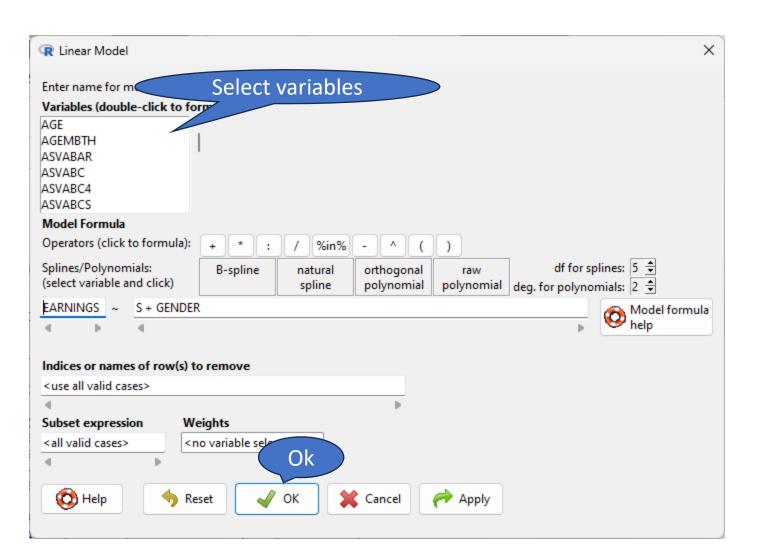
Addressing violation of assumption on normality through Data transformation



```
R Commander
                                                                                                        _ _
File Edit Data Statistics Graphs Models Distributions Tools Help
     Data set: EAWE01 / Edit data set View data set Model: ElinearModel.4
R Script R Markdown
AIC(LinearModel.4)
AIC(LinearModel.2)
LinearModel.5 <- lm(EARNINGS \sim EXP + S, data = EAWE01, subset = -c(c(68), (45), (451), (223), (101), (104), (450)))
summary(LinearModel.5)
anova(LinearModel.2, LinearModel.4)
Anova(LinearModel.5, type="II")
plot(regsubsets(EARNINGS ~ EXP + S, data=EAWE01, nbest=10, nvmax=3), scale='adjr2')
LinearModel.4 <- lm(log(EARNINGS) ~ EXP + S, data = EAWE01)
summary(LinearModel.4)
                                                                                                         Submit 💨
Output
Call:
lm(formula = log(EARNINGS) ~ EXP + S, data = EAWE01)
Residuals:
     Min
             1Q Median 3Q
-2.19367 -0.30849 0.01975 0.30018 2.24242
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) 1.07769 0.19704 5.470 0.0000000716 ***
            0.04769 0.01004 4.748 0.0000026880 ***
            Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.5144 on 497 degrees of freedom
Multiple R-squared: 0.146, Adjusted R-squared: 0.1426
F-statistic: 42.48 on 2 and 497 DF, p-value: < 2.2e-16
Messages
models with response '"log(EARNINGS)"' removed because response differs from model 1
[6] WARNING: Warning in anova.lmlist(object, ...) :
models with response '"log(EARNINGS)"' removed because response differs from model 1
```

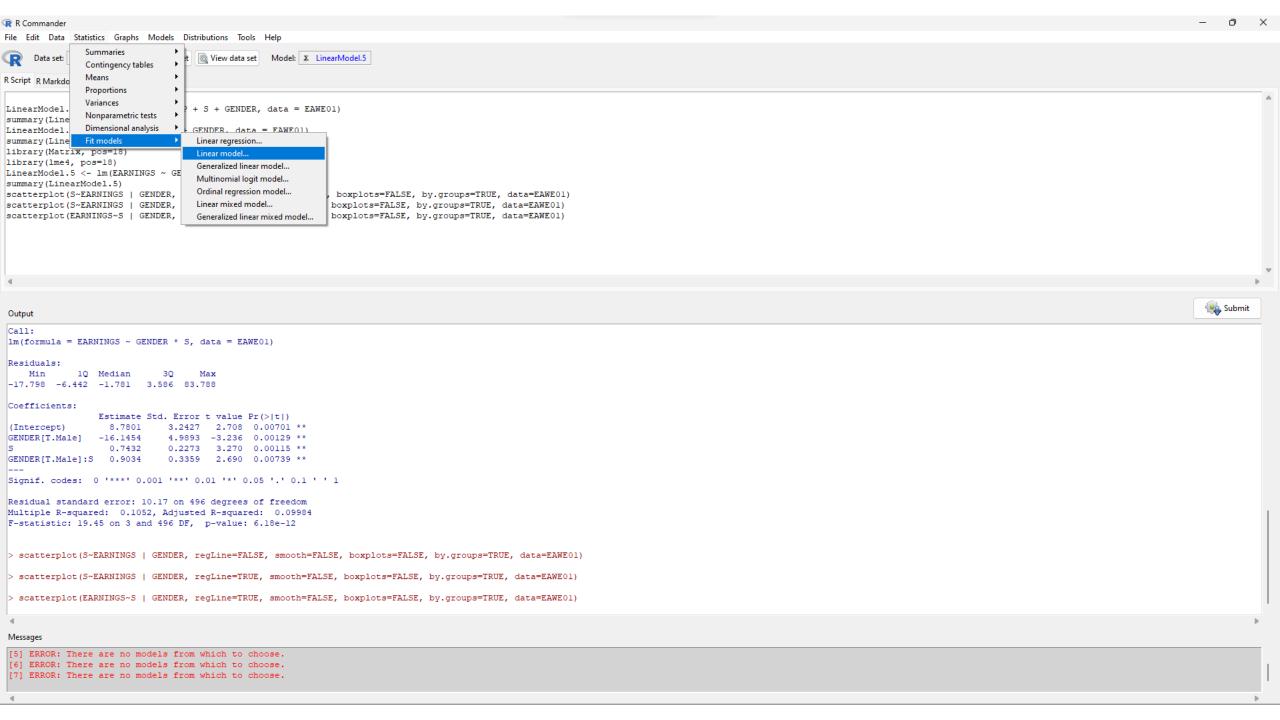
Dummy Variable Regression





```
_ _
R Commander
File Edit Data Statistics Graphs Models Distributions Tools Help
    R Script R Markdown
LinearModel.3 <- lm(EARNINGS ~ EXP + S + GENDER, data = EAWE01)
summary(LinearModel.3)
LinearModel.4 <- lm(EARNINGS ~ S + GENDER, data = EAWE01)
summary(LinearModel.4)
                                                                                                    Submit Submit
Output
Call:
lm(formula = EARNINGS ~ S + GENDER, data = EAWE01)
Residuals:
  Min 1Q Median 3Q Max
-18.922 -6.378 -1.822 3.678 85.436
Coefficients:
              Estimate Std. Error t value Pr(>|t|)
(Intercept) 2.9951 2.4420 1.226 0.22060
              1.1569 0.1684 6.871 1.92e-11 ***
GENDER[T.Male] -2.9600 0.9352 -3.165 0.00165 **
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 10.24 on 497 degrees of freedom
Multiple R-squared: 0.0922, Adjusted R-squared: 0.08854
F-statistic: 25.24 on 2 and 497 DF, p-value: 3.64e-11
Messages
[5] ERROR: There are no models from which to choose.
[6] ERROR: There are no models from which to choose.
[7] ERROR: There are no models from which to choose.
```

Interaction Effect



```
R Commander
                                                                                                      _ _
File Edit Data Statistics Graphs Models Distributions Tools Help
     Data set: EAWE01
                     R Script R Markdown
LinearModel.3 <- lm(EARNINGS ~ EXP + S + GENDER, data = EAWE01)
summary(LinearModel.3)
LinearModel.4 <- lm(EARNINGS ~ S + GENDER, data = EAWE01)
summary(LinearModel.4)
library(Matrix, pos=18)
library(lme4, pos=18)
LinearModel.5 <- lm(EARNINGS ~ GENDER*S, data = EAWE01)
summary(LinearModel.5)
scatterplot(S~EARNINGS | GENDER, regLine=FALSE, smooth=FALSE, boxplots=FALSE, by.groups=TRUE, data=EAWE01)
                                                                                                       Submit 🙀
Output
> scatterplot(EARNINGS~S | GENDER, regLine=TRUE, smooth=FALSE, boxplots=FALSE, by.groups=TRUE, data=EAWE01)
> LinearModel.6 <- lm(EARNINGS ~ GENDER * S, data = EAWE01)
> summary(LinearModel.6)
Call:
lm(formula = EARNINGS ~ GENDER * S, data = EAWE01)
Residuals:
         1Q Median 3Q Max
    Min
-17.798 -6.442 -1.781 3.586 83.788
Coefficients:
               Estimate Std. Error t value Pr(>|t|)
                8.7801 3.2427 2.708 0.00701 **
(Intercept)
GENDER[T.Male] -16.1454
                          4.9893 -3.236 0.00129 **
                          0.2273 3.270 0.00115 **
                 0.7432
GENDER[T.Male]:S 0.9034
                          0.3359 2.690 0.00739 **
Messages
[5] ERROR: There are no models from which to choose.
[6] ERROR: There are no models from which to choose.
[7] ERROR: There are no models from which to choose.
```

