# Empirical software engineering

Lab 3: Design and simulate an experiment Group 9

Anton Lutteman Daniel Olsson Gerson Silva Filho Johan Mejborn

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# Simulate the data

- 1) Simulate for a the sample size per group that you defined in the power analysis.
- a) How does your fitted model looks like?
  - Test Assumption 1 Homoscedasticity

We decided to run a Levene Test to test Homoscedasticity.

```
car::leveneTest(m1)

## Levene's Test for Homogeneity of Variance (center = median)

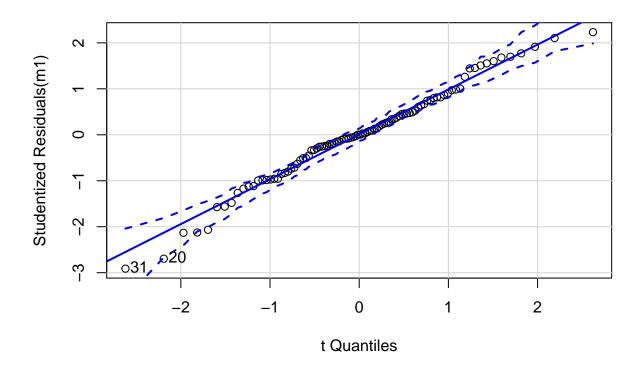
## Df F value Pr(>F)

## group 11   0.77   0.67

## 84
```

The result show that we cannot reject homoscedasticity. Then let's also verify the QQ-Plot in order to get another point of view.

```
car::qqPlot(m1)
```



## [1] 20 31

QQplot shows that the data is homoscedastic.

# • Test Assumtion 2 - Normality

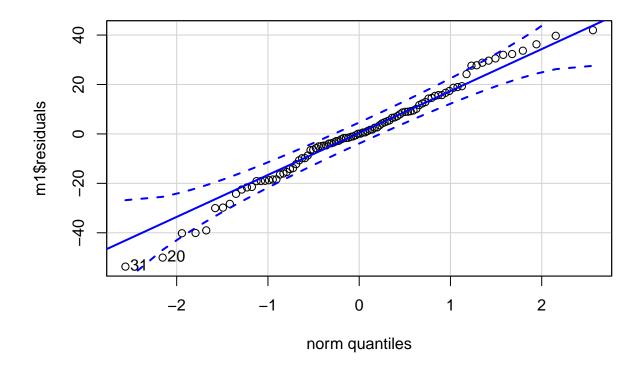
In order to verify normality we run a Shapiro Wilk test.

# shapiro.test(m1\$residuals)

```
##
## Shapiro-Wilk normality test
##
## data: m1$residuals
## W = 1, p-value = 0.4
```

The result show that we cannot reject normallity. And in order to verify it graphically we used the QQ-plot of the residuals.

```
car::qqPlot(m1$residuals)
```



### ## [1] 31 20

The QQplot on the residuals shows normallity.

### • Test Assumtion 3 - Independence

Based on how we collected the data, we can assume independence.

# • The analysis

After all the assumptions have been met, we can run an ANOVA test.

### car::Anova(m1)

```
## Anova Table (Type II tests)
##
## Response: y
##
                            Sum Sq Df F value Pr(>F)
## Language
                                        203.60 < 2e-16
                            172356
## IDE
                                          0.02
                                                 0.886
## Experience
                             42384
                                        100.14 5.6e-16 ***
## Language: IDE
                             10323
                                     2
                                         12.19 2.2e-05 ***
## Language:Experience
                              1497
                                    2
                                          1.77
                                                 0.177
## IDE:Experience
                                                 0.020 *
                              2375
                                          5.61
                                    1
```

```
## Language:IDE:Experience 2274 2 2.69 0.074 .
## Residuals 35555 84
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
```

The ANOVA test shows that we can reject that Language, Experience, Language:IDE, Language:Experience and IDE:Experience has the same mean for the levels because of the low p values.

**Hypothesis 1**: IDE alone doesn't seem to have an effect on LOC but we can see that it has a significant effect in combination with Language and Experience.

**Hypothesis 2**: Experience seem to have a significant effect on LOC based on the result.

Hypothesis 3: Language seem to have a significant effect on LOC bases on the result.

Then to get the highest combination for lines of code we can use the Tukey test:

Tukey multiple comparisons of means

#### TukeyHSD(aov(m1))

##

```
##
       95% family-wise confidence level
##
## Fit: aov(formula = m1)
##
##
  $Language
##
                      lwr upr p adj
                diff
## C++-Java
                  69
                       56
                           81
                                   0
                                   0
## Python-Java
                -33
                      -45 -21
                                   0
  Python-C++ -102 -114 -89
##
##
## $IDE
##
                           diff lwr upr p adj
## Visual Studio-Intelij -0.61
                                  -9 7.7
##
## $Experience
##
                  diff lwr upr p adj
## Senior-Junior
                    42
                       34
                           50
##
## $'Language:IDE'
##
                                                diff
                                                        lwr
                                                                 upr p adj
## C++:Intelij-Java:Intelij
                                                55.5
                                                       34.3
                                                               76.70 0.00
                                                      -42.1
## Python:Intelij-Java:Intelij
                                               -20.9
                                                                0.34
                                                                      0.06
## Java: Visual Studio-Java: Intelij
                                                -1.1
                                                      -22.3
                                                               20.09
                                                                      1.00
                                                       59.3
                                                             101.75
## C++: Visual Studio-Java: Intelij
                                               80.5
                                                                      0.00
                                                              -25.41
## Python: Visual Studio-Java: Intelij
                                               -46.6
                                                      -67.8
                                                      -97.6
                                                             -55.15
## Python:Intelij-C++:Intelij
                                               -76.4
                                                                      0.00
## Java: Visual Studio-C++: Intelij
                                               -56.6
                                                      -77.8
                                                             -35.39
                                                                      0.00
## C++: Visual Studio-C++: Intelij
                                                        3.8
                                                               46.26
                                                                      0.01
                                               25.0
## Python: Visual Studio-C++: Intelij
                                              -102.1 -123.3
                                                              -80.89
                                                                      0.00
## Java: Visual Studio-Python: Intelij
                                               19.8
                                                       -1.5
                                                               40.97
                                                                      0.08
## C++: Visual Studio-Python: Intelij
                                               101.4
                                                       80.2
                                                             122.63
                                                                      0.00
## Python: Visual Studio-Python: Intelij
                                               -25.7
                                                      -47.0
                                                               -4.53
                                                                      0.01
## C++: Visual Studio-Java: Visual Studio
                                                       60.4
                                                             102.87
                                               81.7
                                                                      0.00
## Python: Visual Studio-Java: Visual Studio
                                              -45.5
                                                      -66.7
                                                             -24.29
                                                                      0.00
## Python: Visual Studio - C++: Visual Studio - 127.2 - 148.4 - 105.94 0.00
```

```
##
## $'Language:Experience'
                                         lwr
                                               upr p adj
## C++:Junior-Java:Junior
                                  61.8
                                          41
                                              83.1 0.00
## Python:Junior-Java:Junior
                                 -30.5
                                         -52
                                              -9.3
                                                    0.00
## Java:Senior-Java:Junior
                                  39.3
                                             60.5
                                          18
                                                    0.00
## C++:Senior-Java:Junior
                                 114.6
                                          93 135.8
## Python:Senior-Java:Junior
                                   3.5
                                        -18
                                              24.7
                                                    1.00
## Python:Junior-C++:Junior
                                 -92.4 -114 -71.2
                                                    0 00
## Java:Senior-C++:Junior
                                 -22.5
                                         -44
                                             -1.3
                                                    0.03
## C++:Senior-C++:Junior
                                  52.8
                                          32
                                              74.0
                                                    0.00
## Python:Senior-C++:Junior
                                 -58.4
                                         -80 -37.2
                                                    0.00
## Java:Senior-Python:Junior
                                  69.8
                                          49
                                              91.1
                                                    0.00
## C++:Senior-Python:Junior
                                 145.1
                                         124 166.4
                                                    0.00
                                              55.2
## Python:Senior-Python:Junior
                                  34.0
                                          13
                                                    0.00
## C++:Senior-Java:Senior
                                  75.3
                                          54
                                              96.5
                                                    0.00
                                 -35.8 -57 -14.6
## Python:Senior-Java:Senior
                                                    0.00
## Python:Senior-C++:Senior
                                 -111.1 -132 -89.9
##
## $'IDE:Experience'
##
                                                diff
                                                       lwr upr p adj
## Visual Studio: Junior-Intelij: Junior
                                               -10.6 -26.1
## Intelij:Senior-Intelij:Junior
                                                32.1
                                                      16.5
                                                             48
                                                                 0.00
## Visual Studio:Senior-Intelij:Junior
                                                41.4
                                                      25.9
                                                             57
                                                                 0.00
## Intelij:Senior-Visual Studio:Junior
                                                42.6
                                                      27.1
                                                             58
                                                                 0.00
## Visual Studio:Senior-Visual Studio:Junior
                                                52.0
                                                      36.4
## Visual Studio:Senior-Intelij:Senior
                                                 9.3
                                                      -6.2
                                                             25
                                                                 0.40
  $'Language:IDE:Experience'
##
##
                                                                 diff
                                                                         lwr
                                                                                 upr p adj
## C++:Intelij:Junior-Java:Intelij:Junior
                                                                44.81
                                                                        10.2
                                                                                79.4 0.00
## Python:Intelij:Junior-Java:Intelij:Junior
                                                               -29.94
                                                                       -64.5
                                                                                 4.6
                                                                                      0.16
## Java: Visual Studio: Junior - Java: Intelij: Junior
                                                               -21.51
                                                                       -56.1
                                                                                13.1
                                                                                      0.63
## C++: Visual Studio: Junior-Java: Intelij: Junior
                                                                        22.8
                                                                57.36
                                                                                91.9
                                                                                      0.00
## Python: Visual Studio: Junior-Java: Intelij: Junior
                                                               -52.64
                                                                       -87.2
                                                                               -18.1
                                                                18.92
## Java:Intelij:Senior-Java:Intelij:Junior
                                                                       -15.7
                                                                                53.5
                                                                                      0.79
## C++:Intelij:Senior-Java:Intelij:Junior
                                                                85.08
                                                                        50.5
                                                                               119.7
                                                                                      0.00
## Python:Intelij:Senior-Java:Intelij:Junior
                                                                 7.10
                                                                       -27.5
                                                                                41.7
                                                                                      1.00
## Java: Visual Studio: Senior-Java: Intelij: Junior
                                                                38.18
                                                                          3.6
                                                                                72.8
                                                                                      0.02
## C++: Visual Studio: Senior-Java: Intelij: Junior
                                                                        88.0
                                                                               157.2
                                                                                      0.00
                                                               122.62
## Python: Visual Studio: Senior-Java: Intelij: Junior
                                                                       -56.3
                                                                                12.9
                                                               -21.68
## Python:Intelij:Junior-C++:Intelij:Junior
                                                               -74.75 -109.3
                                                                               -40.2
                                                                                      0.00
## Java: Visual Studio: Junior-C++: Intelij: Junior
                                                               -66.32 -100.9
                                                                               -31.7
## C++:Visual Studio:Junior-C++:Intelij:Junior
                                                                       -22.0
                                                                                47.1
                                                                                      0.99
                                                                12.55
                                                               -97.45 -132.0
                                                                               -62.9
## Python: Visual Studio: Junior-C++: Intelij: Junior
                                                                                      0.00
                                                                       -60.5
## Java:Intelij:Senior-C++:Intelij:Junior
                                                               -25.89
                                                                                 8.7
                                                                                      0.34
## C++:Intelij:Senior-C++:Intelij:Junior
                                                                40.27
                                                                          5.7
                                                                                74.9
                                                                                      0.01
## Python:Intelij:Senior-C++:Intelij:Junior
                                                                                -3.1
                                                               -37.71
                                                                       -72.3
                                                                                      0.02
                                                                                28.0
## Java: Visual Studio: Senior-C++: Intelij: Junior
                                                                -6.63
                                                                       -41.2
                                                                                      1.00
## C++: Visual Studio: Senior-C++: Intelij: Junior
                                                                77.81
                                                                        43.2
                                                                               112.4
                                                                                      0.00
                                                                               -31.9
## Python: Visual Studio: Senior-C++: Intelij: Junior
                                                               -66.49 -101.1
                                                                                      0.00
## Java: Visual Studio: Junior-Python: Intelij: Junior
                                                                 8.43
                                                                       -26.2
                                                                                43.0
                                                                                      1.00
## C++: Visual Studio: Junior-Python: Intelij: Junior
                                                                87.30
                                                                        52.7 121.9
                                                                                      0.00
## Python: Visual Studio: Junior-Python: Intelij: Junior
                                                               -22.70
                                                                       -57.3
                                                                                11.9
                                                                                      0.55
```

```
## Java:Intelij:Senior-Python:Intelij:Junior
                                                                 48.86
                                                                         14.3
                                                                                 83.4
                                                                                       0.00
## C++:Intelij:Senior-Python:Intelij:Junior
                                                                115.02
                                                                         80.4
                                                                                149.6
                                                                                       0.00
                                                                                 71.6
## Python:Intelij:Senior-Python:Intelij:Junior
                                                                 37.05
                                                                          2.5
                                                                                       0.03
## Java: Visual Studio: Senior-Python: Intelij: Junior
                                                                         33.5
                                                                                102.7
                                                                 68.12
                                                                                       0.00
## C++: Visual Studio: Senior-Python: Intelij: Junior
                                                                152.56
                                                                        118.0
                                                                                187.1
                                                                                       0.00
## Python: Visual Studio: Senior-Python: Intelij: Junior
                                                                                 42.8
                                                                  8.26
                                                                        -26.3
                                                                                       1.00
## C++: Visual Studio: Junior-Java: Visual Studio: Junior
                                                                 78.87
                                                                         44.3
                                                                                113.5
                                                                                       0.00
## Python: Visual Studio: Junior-Java: Visual Studio: Junior
                                                                -31.13
                                                                        -65.7
                                                                                  3.5
                                                                                       0.12
## Java:Intelij:Senior-Java:Visual Studio:Junior
                                                                 40.43
                                                                          5.8
                                                                                 75.0
                                                                                       0.01
## C++:Intelij:Senior-Java:Visual Studio:Junior
                                                                106.59
                                                                         72.0
                                                                                141.2
                                                                                       0.00
## Python:Intelij:Senior-Java:Visual Studio:Junior
                                                                 28.61
                                                                         -6.0
                                                                                 63.2
                                                                                       0.21
## Java: Visual Studio: Senior-Java: Visual Studio: Junior
                                                                         25.1
                                                                 59.69
                                                                                 94.3
                                                                                       0.00
## C++: Visual Studio: Senior-Java: Visual Studio: Junior
                                                                144.13
                                                                        109.6
                                                                                178.7
                                                                                       0.00
## Python: Visual Studio: Senior-Java: Visual Studio: Junior
                                                                        -34.8
                                                                 -0.17
                                                                                 34.4
                                                                                       1.00
## Python: Visual Studio: Junior-C++: Visual Studio: Junior
                                                               -110.00 -144.6
                                                                                -75.4
                                                                                       0.00
## Java:Intelij:Senior-C++:Visual Studio:Junior
                                                                -38.44
                                                                        -73.0
                                                                                 -3.9
                                                                                       0.02
## C++:Intelij:Senior-C++:Visual Studio:Junior
                                                                         -6.9
                                                                 27.72
                                                                                 62.3
                                                                                       0.25
## Python:Intelij:Senior-C++:Visual Studio:Junior
                                                                -50.26
                                                                        -84.8
                                                                                -15.7
                                                                                       0.00
## Java: Visual Studio: Senior-C++: Visual Studio: Junior
                                                                        -53.8
                                                                -19.18
                                                                                 15.4
                                                                                       0.78
## C++: Visual Studio: Senior-C++: Visual Studio: Junior
                                                                 65.26
                                                                         30.7
                                                                                 99.8
## Python: Visual Studio: Senior-C++: Visual Studio: Junior
                                                                -79.05 -113.6
                                                                                -44.5
                                                                                       0.00
## Java:Intelij:Senior-Python:Visual Studio:Junior
                                                                                106.1
                                                                 71.56
                                                                         37.0
                                                                                       0.00
## C++:Intelij:Senior-Python:Visual Studio:Junior
                                                                                172.3
                                                                137.72
                                                                        103.1
                                                                                       0.00
## Python:Intelij:Senior-Python:Visual Studio:Junior
                                                                 59.75
                                                                         25.2
                                                                                 94.3
                                                                                       0.00
## Java: Visual Studio: Senior-Python: Visual Studio: Junior
                                                                 90.83
                                                                         56.2
                                                                                125.4
                                                                                       0.00
## C++: Visual Studio: Senior-Python: Visual Studio: Junior
                                                                175.27
                                                                        140.7
                                                                                209.8
                                                                                       0.00
## Python: Visual Studio: Senior-Python: Visual Studio: Junior
                                                                         -3.6
                                                                                 65.5
                                                                 30.96
                                                                                       0.12
## C++:Intelij:Senior-Java:Intelij:Senior
                                                                 66.16
                                                                         31.6
                                                                                100.7
                                                                                       0.00
## Python:Intelij:Senior-Java:Intelij:Senior
                                                                -11.81
                                                                        -46.4
                                                                                 22.8
                                                                                       0.99
## Java: Visual Studio: Senior-Java: Intelij: Senior
                                                                        -15.3
                                                                                 53.8
                                                                                       0.77
                                                                 19.27
## C++: Visual Studio: Senior-Java: Intelij: Senior
                                                                103.71
                                                                         69.1
                                                                                138.3
                                                                                       0.00
## Python: Visual Studio: Senior-Java: Intelij: Senior
                                                                -40.60
                                                                        -75.2
                                                                                 -6.0
                                                                                       0.01
## Python:Intelij:Senior-C++:Intelij:Senior
                                                                -77.97 -112.6
                                                                                -43.4
                                                                                       0.00
                                                                        -81.5
## Java:Visual Studio:Senior-C++:Intelij:Senior
                                                                                -12.3
                                                                -46.89
                                                                                       0.00
## C++: Visual Studio: Senior-C++: Intelij: Senior
                                                                 37.55
                                                                          3.0
                                                                                 72.1
                                                               -106.76 -141.3
                                                                                -72.2
## Python: Visual Studio: Senior-C++: Intelij: Senior
                                                                                       0.00
## Java: Visual Studio: Senior-Python: Intelij: Senior
                                                                 31.08
                                                                         -3.5
                                                                                 65.7
                                                                                       0.12
## C++: Visual Studio: Senior-Python: Intelij: Senior
                                                                         80.9
                                                                                150.1
                                                                                       0.00
                                                                115.52
## Python: Visual Studio: Senior-Python: Intelij: Senior
                                                                        -63.4
                                                                -28.79
                                                                                  5.8
                                                                                       0.20
## C++: Visual Studio: Senior-Java: Visual Studio: Senior
                                                                 84.44
                                                                         49.9
                                                                                119.0
                                                                                       0.00
## Python: Visual Studio: Senior-Java: Visual Studio: Senior
                                                                -59.87
                                                                        -94.5
                                                                                -25.3
                                                                                       0.00
## Python: Visual Studio: Senior-C++: Visual Studio: Senior
                                                               -144.31 -178.9 -109.7
```

Without drawing conclusions for all combinations presented by the Tukey test we can say that the highest combination for lines of code is Language = C++, IDE = Visual Studio and Experience = Senior.

### b) How do it compare with your 'true' model you defined in the simulation.

When we compare the created model defined in our main function with the defined coefficients, with the data generated by the model, we can see that they are similar. Also we can notice some variations that can be explained either by the defined standard deviation of the model, or that the model interpreted the data in another way than what we set up. The difference in the first order is very small compared to our true model, however the third order interactions are deviating quite a bit compared to our true model.

We can observe the differences looking in the following table and the defined factors:

	Defined Coeficients	Model Coeficients
(Intercept)	100	100.7
LanguageC++	50	44.8
LanguagePython	-30	-29.9
IDEVisual Studio	-10	-21.5
ExperienceSenior	30	18.9
LanguageC++:IDEVisual Studio	20	34.1
LanguagePython:IDEVisual Studio	-20	-1.2
LanguageC++:ExperienceSenior	10	21.4
LanguagePython:ExperienceSenior	10	18.1
IDEVisual Studio:ExperienceSenior	20	40.8
LanguageC++:IDEVisual Studio:ExperienceSenior	10	-15.8
Language Python: IDEV is ual~Studio: Experience Senior	-15	-46.9

# 2) Simulate for an underpowered study with half the sample size you calculated in the power analysis

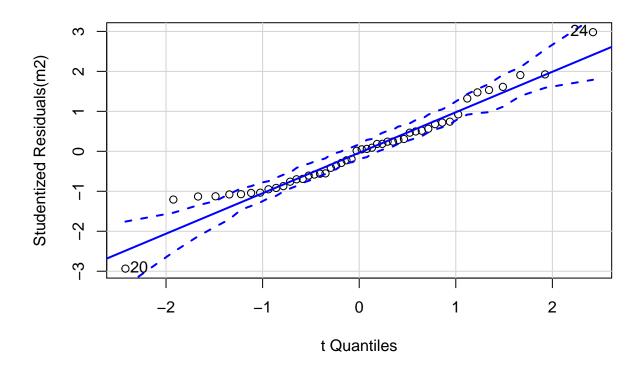
- a) How does your fitted model looks like?
  - Test Assumption 1 Homoscedasticity

We decided to run a Levene Test to test Homoscedasticity.

```
## Levene's Test for Homogeneity of Variance (center = median)
## Df F value Pr(>F)
## group 11    0.4    0.95
## 36
```

The result show that we cannot reject homoscedasticity. Then let's also verify the QQ-Plot in order to get another point of view.

```
car::qqPlot(m2)
```



## [1] 20 24

QQplot shows that the data is homoscedastic.

# • Test Assumtion 2 - Normality

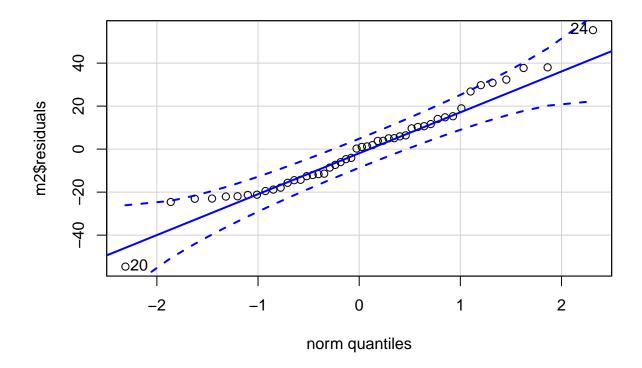
In order to verify normality we run a Shapiro Wilk test.

# shapiro.test(m2\$residuals)

```
##
## Shapiro-Wilk normality test
##
## data: m2$residuals
## W = 1, p-value = 0.2
```

The result show that we cannot reject normallity. And in order to verify it graphically we used the QQ-plot of the residuals.

```
car::qqPlot(m2$residuals)
```



### ## [1] 24 20

The QQplot on the residuals shows normallity.

# • Test Assumtion 3 - Independence

Based on how we collected the data, we can assume independence.

# • The analysis

After all the assumptions have been met, we can run an ANOVA test.

### car::Anova(m2)

```
## Anova Table (Type II tests)
##
## Response: y
##
                            Sum Sq Df F value Pr(>F)
## Language
                             73167
                                         65.33 1.0e-12
## IDE
                               208
                                                  0.546
                                     1
                                          0.37
## Experience
                             25459
                                         45.46 7.2e-08 ***
## Language: IDE
                              2203
                                     2
                                          1.97
                                                 0.155
## Language:Experience
                               536
                                     2
                                          0.48
                                                  0.624
## IDE:Experience
                                          0.09
                                                 0.760
                                 53
                                     1
```

```
## Language:IDE:Experience 2794 2 2.49 0.097 .
## Residuals 20161 36
## ---
## Signif. codes: 0 '*** 0.001 '** 0.05 '.' 0.1 ' ' 1
```

The ANOVA test shows that we can reject that Language, Experience, Language:IDE, Language:Experience and IDE:Experience has the same mean for the levels because of the low p values.

Hypothesis 1: IDE doesn't seem to have an effect on LOC neither alone nor as an interaction.

Hypothesis 2: Experience seem to have a significant effect on LOC based on the result.

Hypothesis 3: Language seem to have a significant effect on LOC bases on the result.

Then to get the highest combination for lines of code we can use the Tukey test:

Tukey multiple comparisons of means

### TukeyHSD(aov(m2))

##

```
##
       95% family-wise confidence level
##
## Fit: aov(formula = m2)
##
## $Language
##
               diff
                      lwr upr p adj
## C++-Java
                 60
                       40
                           81
                                  0
                -34
                     -55 -14
## Python-Java
## Python-C++
                -94 -115 -74
                                  0
##
## $IDE
##
                          diff lwr upr p adj
## Visual Studio-Intelij -4.2 -18 9.7 0.55
##
## $Experience
##
                 diff lwr upr p adj
##
  Senior-Junior
                    46
                       32
                            60
##
## $'Language:IDE'
##
                                               diff
                                                     lwr
                                                           upr p adj
                                                      21
                                                                0.00
## C++:Intelij-Java:Intelij
                                               56.2
                                                          91.8
## Python:Intelij-Java:Intelij
                                              -22.3
                                                     -58
                                                          13.3
## Java: Visual Studio-Java: Intelij
                                                          36.7
                                                1.1
                                                     -34
                                                                 1.00
## C++: Visual Studio-Java: Intelij
                                               65.4
                                                      30 100.9
                                                                 0.00
## Python: Visual Studio-Java: Intelij
                                              -45.1
                                                     -81
                                                          -9.5
                                                                 0.01
## Python:Intelij-C++:Intelij
                                              -78.5 -114 -42.9
## Java: Visual Studio-C++: Intelij
                                              -55.1
                                                     -91 -19.5
                                                                 0.00
## C++: Visual Studio-C++: Intelij
                                                9.2
                                                     -26
                                                          44.8
                                                                 0.97
## Python: Visual Studio-C++: Intelij
                                             -101.3 -137 -65.7
                                                                 0.00
## Java: Visual Studio-Python: Intelij
                                               23.4
                                                     -12
                                                         59.0
## C++: Visual Studio-Python: Intelij
                                               87.6
                                                      52 123.2
                                                                 0.00
## Python: Visual Studio-Python: Intelij
                                              -22.8
                                                     -58
                                                          12.8
                                                                0.41
## C++: Visual Studio-Java: Visual Studio
                                               64.2
                                                      29
                                                          99.8
                                                                0.00
## Python: Visual Studio-Java: Visual Studio -46.2 -82 -10.6 0.00
## Python: Visual Studio-C++: Visual Studio
                                            -110.4 -146 -74.8 0.00
##
```

```
## $'Language:Experience'
##
                                  diff
                                                 upr p adj
                                          lwr
                                         20.2
## C++:Junior-Java:Junior
                                  55.8
                                               91.4 0.00
                                        -66.1
## Python:Junior-Java:Junior
                                 -30.5
                                                5.1
                                                     0.13
## Java:Senior-Java:Junior
                                  45.6
                                         10.0
                                               81.2
## C++:Senior-Java:Junior
                                 110.2
                                         74.6 145.8
                                                     0.00
## Python:Senior-Java:Junior
                                   7.6 - 28.0
                                               43.2
## Python:Junior-C++:Junior
                                 -86.3 -121.9 -50.7
                                                      0.00
## Java:Senior-C++:Junior
                                 -10.2
                                        -45.8
                                               25.4
                                                      0.95
## C++:Senior-C++:Junior
                                  54.5
                                         18.9
                                               90.1
                                                      0.00
## Python:Senior-C++:Junior
                                 -48.1
                                        -83.7 -12.5
                                                      0.00
## Java:Senior-Python:Junior
                                  76.1
                                         40.5 111.7
                                                      0.00
## C++:Senior-Python:Junior
                                 140.8
                                        105.2 176.4
                                                      0.00
## Python:Senior-Python:Junior
                                  38.1
                                          2.5
                                              73.7
                                                      0.03
                                  64.7
                                         29.1 100.3
## C++:Senior-Java:Senior
                                                      0.00
## Python:Senior-Java:Senior
                                 -37.9 -73.5
                                              -2.3
                                                      0.03
                                -102.6 -138.2 -67.0 0.00
## Python:Senior-C++:Senior
## $'IDE:Experience'
##
                                              diff lwr upr p adj
## Visual Studio: Junior-Intelij: Junior
                                              -6.3 -32
                                                         20 0.92
## Intelij:Senior-Intelij:Junior
                                              44.0
                                                    18
                                                         70
                                                            0.00
## Visual Studio:Senior-Intelij:Junior
                                                         68
                                              41.9
                                                    16
                                                             0.00
## Intelij:Senior-Visual Studio:Junior
                                              50.2
                                                    24
                                                         76
                                                             0.00
                                                             0.00
## Visual Studio:Senior-Visual Studio:Junior 48.2
                                                    22
## Visual Studio:Senior-Intelij:Senior
                                              -2.1 -28
                                                             1.00
##
## $'Language:IDE:Experience'
##
                                                               diff
                                                                        lwr
                                                                               upr p adj
## C++:Intelij:Junior-Java:Intelij:Junior
                                                               58.8
                                                                       0.36 117.2
                                                                                   0.05
## Python:Intelij:Junior-Java:Intelij:Junior
                                                              -30.1
                                                                     -88.47
                                                                              28.3
                                                                                    0.81
## Java:Visual Studio:Junior-Java:Intelij:Junior
                                                               -4.0
                                                                     -62.36
                                                                             54.4
                                                                                    1.00
## C++: Visual Studio: Junior-Java: Intelij: Junior
                                                               48.8
                                                                       -9.62 107.2
                                                                                    0.18
## Python: Visual Studio: Junior-Java: Intelij: Junior
                                                              -34.9
                                                                     -93.34
                                                                              23.5
                                                                                    0.63
## Java:Intelij:Senior-Java:Intelij:Junior
                                                               40.5
                                                                     -17.91
                                                                              98.9
## C++:Intelij:Senior-Java:Intelij:Junior
                                                               94.1
                                                                      35.71 152.5
                                                                                   0.00
## Python:Intelij:Senior-Java:Intelij:Junior
                                                               26.0
                                                                     -32.44 84.4 0.91
## Java: Visual Studio: Senior-Java: Intelij: Junior
                                                               46.7
                                                                     -11.74 105.1
                                                                                    0.23
## C++: Visual Studio: Senior-Java: Intelij: Junior
                                                              122.4
                                                                       64.00 180.8
## Python: Visual Studio: Senior-Java: Intelij: Junior
                                                                            43.7
                                                              -14.7
                                                                     -73.09
                                                                                    1.00
## Python:Intelij:Junior-C++:Intelij:Junior
                                                              -88.8 -147.24 -30.4
## Java: Visual Studio: Junior-C++: Intelij: Junior
                                                              -62.7 -121.13
                                                                             -4.3
                                                                                    0.03
## C++:Visual Studio:Junior-C++:Intelij:Junior
                                                              -10.0 -68.39
                                                                             48.4
                                                              -93.7 -152.11 -35.3 0.00
## Python: Visual Studio: Junior-C++: Intelij: Junior
## Java:Intelij:Senior-C++:Intelij:Junior
                                                              -18.3 -76.68
                                                                             40.1
## C++:Intelij:Senior-C++:Intelij:Junior
                                                                     -23.05
                                                                              93.8
                                                                                    0.62
                                                               35.4
## Python:Intelij:Senior-C++:Intelij:Junior
                                                              -32.8
                                                                     -91.21
                                                                              25.6
                                                                                    0.72
## Java: Visual Studio: Senior-C++: Intelij: Junior
                                                              -12.1
                                                                     -70.51
                                                                             46.3
                                                                                   1.00
## C++:Visual Studio:Senior-C++:Intelij:Junior
                                                               63.6
                                                                       5.23 122.0
                                                                                    0.02
## Python: Visual Studio: Senior-C++: Intelij: Junior
                                                              -73.4 -131.85 -15.0
                                                                                    0.00
## Java: Visual Studio: Junior-Python: Intelij: Junior
                                                               26.1 -32.29 84.5
                                                                                    0.91
## C++: Visual Studio: Junior-Python: Intelij: Junior
                                                               78.9
                                                                      20.45 137.3 0.00
## Python: Visual Studio: Junior-Python: Intelij: Junior
                                                               -4.9 -63.27 53.5
                                                                                   1.00
## Java:Intelij:Senior-Python:Intelij:Junior
                                                               70.6
                                                                      12.15 129.0 0.01
```

```
## C++:Intelij:Senior-Python:Intelij:Junior
                                                               124.2
                                                                        65.78 182.6 0.00
## Python:Intelij:Senior-Python:Intelij:Junior
                                                                56.0
                                                                        -2.37 114.4
                                                                                    0.07
## Java: Visual Studio: Senior-Python: Intelij: Junior
                                                                76.7
                                                                       18.33 135.1
## C++: Visual Studio: Senior-Python: Intelij: Junior
                                                                       94.07 210.9
                                                               152.5
## Python: Visual Studio: Senior-Python: Intelij: Junior
                                                                15.4
                                                                      -43.02
                                                                              73.8
                                                                                     1.00
## C++: Visual Studio: Junior-Java: Visual Studio: Junior
                                                                52.7
                                                                        -5.66 111.2 0.11
## Python: Visual Studio: Junior-Java: Visual Studio: Junior
                                                               -31.0
                                                                      -89.38 27.4
                                                                      -13.96 102.9
## Java:Intelij:Senior-Java:Visual Studio:Junior
                                                                44.4
                                                                                     0.29
## C++:Intelij:Senior-Java:Visual Studio:Junior
                                                                98.1
                                                                       39.67 156.5
## Python:Intelij:Senior-Java:Visual Studio:Junior
                                                                29.9
                                                                      -28.48 88.3
                                                                                     0.81
## Java: Visual Studio: Senior-Java: Visual Studio: Junior
                                                                50.6
                                                                        -7.79 109.0
## C++: Visual Studio: Senior-Java: Visual Studio: Junior
                                                               126.4
                                                                       67.96 184.8
                                                                                     0.00
## Python: Visual Studio: Senior-Java: Visual Studio: Junior
                                                               -10.7
                                                                      -69.13 47.7
                                                                                     1.00
## Python: Visual Studio: Junior-C++: Visual Studio: Junior
                                                               -83.7 -142.13 -25.3
                                                                                     0.00
## Java:Intelij:Senior-C++:Visual Studio:Junior
                                                                -8.3
                                                                      -66.70 50.1
                                                                                     1.00
## C++:Intelij:Senior-C++:Visual Studio:Junior
                                                                      -13.07 103.7
                                                                45.3
## Python:Intelij:Senior-C++:Visual Studio:Junior
                                                               -22.8
                                                                      -81.23
                                                                               35.6
                                                                                     0.96
## Java: Visual Studio: Senior-C++: Visual Studio: Junior
                                                                -2.1
                                                                      -60.53
                                                                               56.3
## C++:Visual Studio:Senior-C++:Visual Studio:Junior
                                                                73.6
                                                                       15.21 132.0
                                                                                     0.00
## Python: Visual Studio: Senior-C++: Visual Studio: Junior
                                                               -63.5 -121.87
                                                                               -5.1
## Java:Intelij:Senior-Python:Visual Studio:Junior
                                                                75.4
                                                                       17.02 133.8
## C++:Intelij:Senior-Python:Visual Studio:Junior
                                                                       70.65 187.5
                                                               129.1
## Python:Intelij:Senior-Python:Visual Studio:Junior
                                                                                     0.03
                                                                60.9
                                                                        2.49 119.3
## Java: Visual Studio: Senior-Python: Visual Studio: Junior
                                                                81.6
                                                                       23.19 140.0
## C++: Visual Studio: Senior-Python: Visual Studio: Junior
                                                               157.3
                                                                       98.94 215.7
                                                                                     0.00
## Python: Visual Studio: Senior-Python: Visual Studio: Junior
                                                                20.3
                                                                      -38.15 78.7
## C++:Intelij:Senior-Java:Intelij:Senior
                                                                       -4.78 112.0
                                                                53.6
                                                                                     0.10
## Python:Intelij:Senior-Java:Intelij:Senior
                                                               -14.5
                                                                      -72.93 43.9
                                                                                     1.00
## Java: Visual Studio: Senior - Java: Intelij: Senior
                                                                 6.2
                                                                      -52.23 64.6
                                                                                    1.00
## C++: Visual Studio: Senior-Java: Intelij: Senior
                                                                        23.51 140.3
                                                                81.9
## Python: Visual Studio: Senior-Java: Intelij: Senior
                                                               -55.2 -113.58
                                                                                3.2
                                                                                     0.08
## Python:Intelij:Senior-C++:Intelij:Senior
                                                               -68.2 -126.56
                                                                               -9.7
                                                                                     0.01
## Java: Visual Studio: Senior-C++: Intelij: Senior
                                                               -47.5 -105.86
                                                                               10.9
## C++:Visual Studio:Senior-C++:Intelij:Senior
                                                                      -30.12 86.7
                                                                28.3
                                                                                     0.86
## Python: Visual Studio: Senior-C++: Intelij: Senior
                                                              -108.8 -167.20 -50.4
## Java: Visual Studio: Senior-Python: Intelij: Senior
                                                                20.7
                                                                      -37.71
                                                                             79.1
## C++: Visual Studio: Senior-Python: Intelij: Senior
                                                                       38.04 154.8
## Python: Visual Studio: Senior-Python: Intelij: Senior
                                                                      -99.05 17.8
                                                               -40.6
## C++: Visual Studio: Senior-Java: Visual Studio: Senior
                                                                75.7
                                                                        17.34 134.1
## Python: Visual Studio: Senior-Java: Visual Studio: Senior
                                                               -61.3 -119.75
                                                                             -2.9
                                                                                     0.03
## Python: Visual Studio: Senior-C++: Visual Studio: Senior
                                                              -137.1 -195.49 -78.7
```

Without drawing conclusions for all combinations presented by the Tukey test we can say that the highest combination for lines of code is Language = C++ and Experience = Senior.

# b) How do it compare with your 'true' model you defined in the simulation

When we compare the created model defined in our main function with the defined coefficients, with the data generated by the model, we can see that they are similar. Also we can notice some variations that can be explained either by the defined standard deviation of the model, or that the model interpreted the data in another way than what we set up. The difference in the first order is very small compared to our true model, however the third order interactions are deviating quite a bit compared to our true model.

We can observe the differences looking in the following table and the defined factors:

	Defined Coeficients	Model Coeficients
(Intercept)	100	97.97
LanguageC++	50	58.77
LanguagePython	-30	-30.07
IDEVisual Studio	-10	-3.96
ExperienceSenior	30	40.49
LanguageC++:IDEVisual Studio	20	-6.02
LanguagePython:IDEVisual Studio	-20	-0.91
LanguageC++:ExperienceSenior	10	-5.14
LanguagePython:ExperienceSenior	10	15.54
IDEVisual Studio:ExperienceSenior	20	10.13
LanguageC++:IDEVisual Studio:ExperienceSenior	10	28.14
Language Python: IDEV is ual~Studio: Experience Senior	-15	-45.91

# c) How do the results change compared to the correctly powered experiment.

When we compare the two models we see some differences between them. These could be explained by the standard deviation and the small sample size. We also get more coefficients with small p values that are to be considered statistically significant for m1.

Comparing the analysis on the two models show similar result for Hypothesis 2 and 3 but for model two we do not see an interaction effect for IDE. This means we can't reject the null hypothesis for hypothesis 1 that the means are equal for the different IDEs.