Project2

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Importing in R

```
student.mat<-read.csv('~/Desktop/Shipwreck/student-mat.csv',sep = ",")
head(student.mat)</pre>
```

##		school	sex	age	addre	ss :	fam	size	Psta	tus	Medu	Fedu		Mjob		Fjob	
##	1	GP	F	18		U		GT3		Α	4	4	ā	at_home	t	eacher	
##	2	GP	F	17		U		GT3		T	1	1	8	at_home		other	
##	3	GP	F	15		U		LE3		T	1	1	8	at_home		other	
##	4	GP	F	15		U		GT3		T	4	2		health	se	rvices	
##	5	GP	F	16		U		GT3		T	3	3		other		other	
##	6	GP	M	16		U		LE3		T	4	3	se	ervices		other	
##		rea	reason gua		dian	travel		time	stud	lytim	e fa:	ilure	នន	schoolsu	ıp	famsup	paid
##	1	COI	ırse	mc	ther			2			2		0	ye	es	no	no
##	2	COI	ırse	fa	ther			1			2		0	n	10	yes	no
##	3	of	ther	mc	ther			1			2		3	yе	es	no	yes
##	4	ŀ	nome	mc	ther			1			3		0	n	10	yes	yes
##	5	ŀ	nome	fa	ther			1			2		0	n	10	yes	yes
##	6	reputat	tion	mc	ther			1			2		0	n	10	yes	yes
			-ioa		ort h	i ch	۵r	inter	rnet.	roma	ntic	famr	el	freetim	ıe.	gooit.	Dalc
##		activi	ries	nurs	sery ii	TRI	CI		- 1100	1 Oma						50000	Ju-0
##	_	activi	no	nurs	yes	_	es	111001	no	1 Oma	no		4		3	4	1
## ##	2	activi		nurs	•	У				Toma			4 5		3 3	4 3	1 1
## ## ##	2	activi	no	nurs	yes	y.	es	111001	no	Toma	no		4 5 4		3 3 3	4 3 2	1 1 2
## ## ## ##	2 3 4	activi	no no		yes no	y y	es es	111001	no yes	I Oma	no no		4 5 4 3		3 3 3 2	4 3 2 2	1 1 2 1
## ## ## ##	2 3 4 5	activi	no no no yes no		yes no yes	y y	es es es	111001	no yes yes	I Oma	no no no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1
## ## ## ## ##	2 3 4 5		no no no yes no yes		yes no yes yes yes yes	y , y , y , y , y , y , y , y , y , y ,	es es es es		no yes yes yes	Toma	no no no yes		4 5 4 3		3 3 3 2	4 3 2 2	1 1 2 1
## ## ## ## ## ##	2 3 4 5 6	Walc he	no no no yes no yes	ı abs	yes no yes yes yes yes yes ences	y y y y y y G1	es es es es es G2	G3	no yes yes yes	Toma	no no no yes no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1
## ## ## ## ## ##	2 3 4 5 6	Walc he	no no no yes no yes ealth	n abs	yes no yes yes yes yes sences	y y y y y y G1 5 5	es es es es es G2	G3 6	no yes yes yes	Toma	no no no yes no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1
## ## ## ## ## ##	2 3 4 5 6	Walc he 1 1	no no yes no yes ealth	n abs	yes no yes yes yes yes yes sences	y y y y y G1 5 5 5	es es es es es G2	G3 6 6	no yes yes yes	Toma	no no no yes no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1
## ## ## ## ## ##	2 3 4 5 6 1 2 3	Walc he 1 1 3	no no no yes no yes ealth	n abs 3 3	yes no yes yes yes yes 4 10	y y y y y y y S G1 5 5 7	es es es es es G2 6	G3 6 6	no yes yes yes	Toma	no no no yes no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1
## ## ## ## ## ## ##	2 3 4 5 6 1 2 3 4	Walc he 1 1 3 1	no no no yes no yes ealth	n abs	yes no yes yes yes yes fences 6 4 10	y, y, y, y, s G1 5 5 7 7 2 15	es es es es es G2 6 5	G3 6 6 10	no yes yes yes	Toma	no no no yes no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1
## ## ## ## ## ##	2 3 4 5 6 1 2 3 4 5	Walc he 1 1 3	no no no yes no yes ealth	n abs	yes no yes yes yes yes yes 4 10 24	y, y, y, y, y, 3; G1 5; 5 7, 2; 15	es es es es G2 6 5 8 14	G3 6 6 10 15	no yes yes yes	Toma	no no no yes no		4 5 4 3 4		3 3 2 3	4 3 2 2 2	1 1 2 1

A small function to check for missing values within a vector. ## 1. Investigation of the performance in G3

```
na.test <- function (x) {
  output <- any(is.na(x)== TRUE)
return(output)
}
sprintf('Applying the function to every column');</pre>
```

[1] "Applying the function to every column"

```
apply(student.mat, 2, 'na.test')
```

##	school	sex	age	address	famsize	Pstatus
##	FALSE	FALSE	FALSE	FALSE	FALSE	FALSE
##	Medu	Fedu	Mjob	Fjob	reason	guardian
##	FALSE	FALSE	FALSE	FALSE	FALSE	FALSE
##	traveltime	studytime	failures	schoolsup	famsup	paid
##	FALSE	FALSE	FALSE	FALSE	FALSE	FALSE
##	activities	nursery	higher	internet	romantic	famrel
##	FALSE	FALSE	FALSE	FALSE	FALSE	FALSE
##	freetime	goout	Dalc	Walc	health	absences
##	FALSE	FALSE	FALSE	FALSE	FALSE	FALSE
##	G1	G2	G3			
##	FALSE	FALSE	FALSE			

2. What is the impact of age and the sex on performance(G3)?

First of all, I checked whether there is a difference in performance between boys and girls.

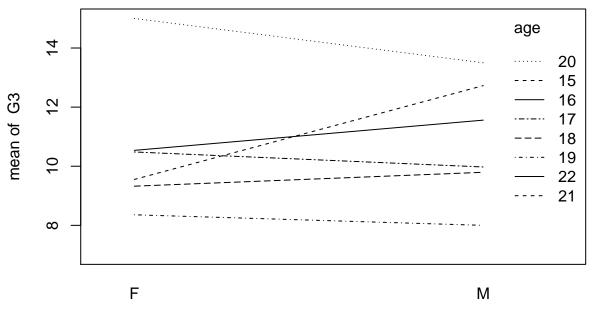
```
gender.dif <- t.test(student.mat$G3~student.mat$sex,var.equal = TRUE)
library(apa)
apa(gender.dif)</pre>
```

```
## [1] "*t*(393) = -2.06, *p* = .040, *d* = -0.21"
```

The mean values between the genders is not equal. Now, I go a step further and take also the age into consideration.

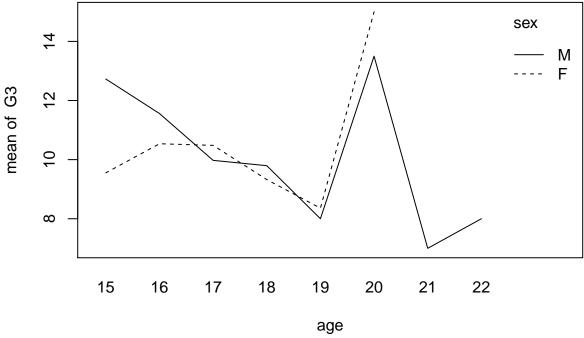
```
summary(with(student.mat, aov(G3 ~ sex + age + sex*age)))
```

```
Df Sum Sq Mean Sq F value Pr(>F)
##
## sex
                       89
                            88.51
                                   4.385 0.03690 *
                      208
                           208.24
                                  10.317 0.00143 **
## age
                            80.74
                                   4.000 0.04619 *
                 1
                       81
## sex:age
                            20.19
## Residuals
              391
                    7892
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
with(student.mat, interaction.plot(sex, age, G3))
```



with(student.mat, interaction.plot(age, sex, G3))

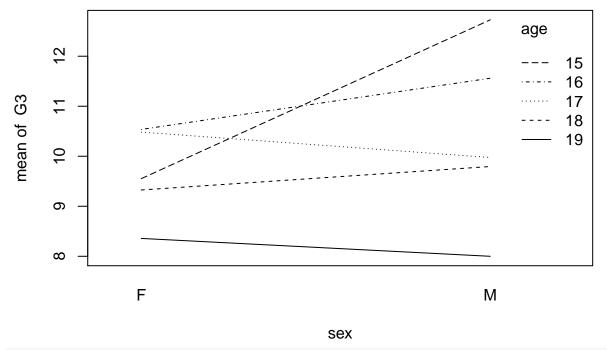
sex



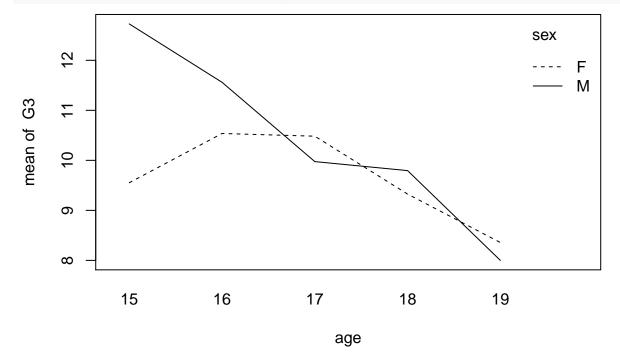
```
table(student.mat$age)
##
           17
##
               18
                        20
                                22
    15 16
                   19
                            21
   82 104
           98
               82
                   24
                         3
                             1
                                 1
student.mat.2 <- subset(student.mat, age < 20)</pre>
table(student.mat.2$age)
##
##
    15 16
           17
                18
                    19
    82 104
            98
                82
                    24
summary(with(student.mat.2, aov(G3 ~ sex + age + sex*age)))
##
                Df Sum Sq Mean Sq F value
                                            Pr(>F)
## sex
                            93.56
                                    4.665 0.031406 *
                 1
                       94
                 1
                           240.21
                                  11.975 0.000599 ***
## age
                      240
## sex:age
                 1
                       95
                            95.50
                                    4.761 0.029714 *
## Residuals
               386
                     7743
                            20.06
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

While eliminating the outliers, the probability that the treatment means differ became less likely for every factor. Now, I redo the interaction plots, too.

```
with(student.mat.2, interaction.plot(sex, age, G3))
```



with(student.mat.2, interaction.plot(age, sex, G3))



Especially the last plot looks better. But as it seems, the interaction is more difficult to understand. I was wondering why the performance of boys gradually (linearly) decreases when boys grow older and why the performance of girls stays more constant with reference to the age. Looking at the mean values this thought is reinforced.

library(tidyverse)

Loading tidyverse: ggplot2
Loading tidyverse: tibble
Loading tidyverse: tidyr

```
## Loading tidyverse: readr
## Loading tidyverse: purrr
## Loading tidyverse: dplyr
## Warning: package 'ggplot2' was built under R version 3.3.2
## Conflicts with tidy packages -----
## filter(): dplyr, stats
## lag():
            dplyr, stats
student.mat.2 %>%
  group_by(age, sex) %>%
  summarise(
    a.mean = mean(G3)
## Source: local data frame [10 x 3]
## Groups: age [?]
##
##
              sex
                      a.mean
       age
##
                       <dbl>
      <int> <fctr>
## 1
         15
                F 9.552632
## 2
         15
                M 12.727273
## 3
         16
                F 10.537037
                M 11.560000
## 4
         16
## 5
         17
                F 10.482759
                M 9.975000
## 6
         17
## 7
         18
                F 9.325581
## 8
         18
                M 9.794872
## 9
         19
                 F 8.357143
## 10
         19
                 M 8.000000
Consequently, I checked the correlation between age and the performance for two subsets holding boys and
girls separately.
cor.test1 <- with(subset(student.mat.2, sex == "M"),</pre>
     cor.test(G3, age))
cor.test1
##
## Pearson's product-moment correlation
##
## data: G3 and age
## t = -4.13, df = 181, p-value = 5.535e-05
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.4206139 -0.1550039
## sample estimates:
##
          cor
## -0.2934623
apa(cor.test1)
## [1] "*r*(181) = -.29, *p* < .001"
cor.test2 <- with(subset(student.mat.2, sex == "F"),</pre>
     (cor.test(G3, age)))
```

cor.test2

```
##
## Pearson's product-moment correlation
##
## data: G3 and age
## t = -0.93582, df = 205, p-value = 0.3505
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.1998139  0.0717874
## sample estimates:
## cor
## -0.06522112
apa(cor.test2)
```

```
## [1] "*r*(205) = -.07, *p* = .350"
```

As expected, there is a correlation between age and performance for boys and none for girls. Therefore, I will focus on the boys. I calculate a linear regression analysis between age and performance in order to get further information.

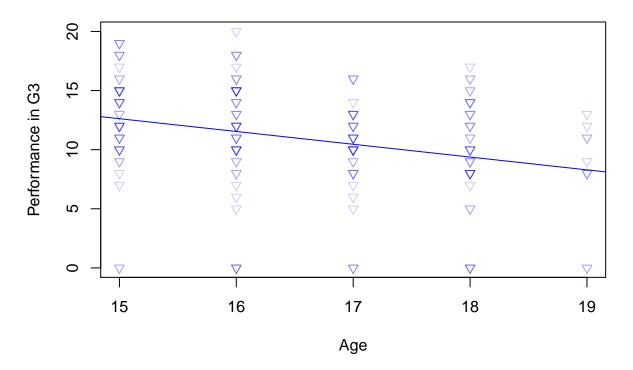
```
with(subset(student.mat.2, sex == "M"),
     summary(lm(G3~ age)))
##
## Call:
## lm(formula = G3 ~ age)
##
## Residuals:
##
       Min
                 1Q
                      Median
                                   3Q
                                           Max
## -12.6200 -1.5383
                      0.4617
                               2.6252
                                        8.4617
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 28.8464
                           4.3514 6.629 3.75e-10 ***
## age
               -1.0818
                           0.2619 -4.130 5.53e-05 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 4.311 on 181 degrees of freedom
## Multiple R-squared: 0.08612,
                                   Adjusted R-squared:
## F-statistic: 17.06 on 1 and 181 DF, p-value: 5.535e-05
```

The probability that the group means are equal is, of course, the same as in the correlation analysis. However, with the linear regression we can predict values and show a tendency with a regression line. Last but not least, I show the results in a scatter plot:

```
plot(1,
     xlim = c(15, 19),
     ylim = c(0, 20),
     type = "n",
     main = "Relationship between age and performance",
     xlab = "Age",
     ylab = "Performance in G3"
     )

#Now, I fill in the points.
with(subset(student.mat.2, sex == "M"),
```

Relationship between age and performance



3. What is the relationship between failures and performance with reference to the age?

While eliminating persons older than 20, I recognized that these persons have bad grades. So at first, I checked the correlation between failures and age.

```
cor.test3 <- with(student.mat, cor.test(age, failures))</pre>
apa(cor.test3)
## [1] "*r*(393) = .24, *p* < .001"
cor.test2 <- with(subset(student.mat.2, sex == "F"),</pre>
     (cor.test(G3, age)))
cor.test2
##
##
    Pearson's product-moment correlation
##
## data: G3 and age
## t = -0.93582, df = 205, p-value = 0.3505
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.1998139 0.0717874
## sample estimates:
## -0.06522112
```

The results reveal a strong connection between failures and age. This maybe explains why there are people of 22 in a school class. Furthermore, I explored the relationship between age, failures and the performance

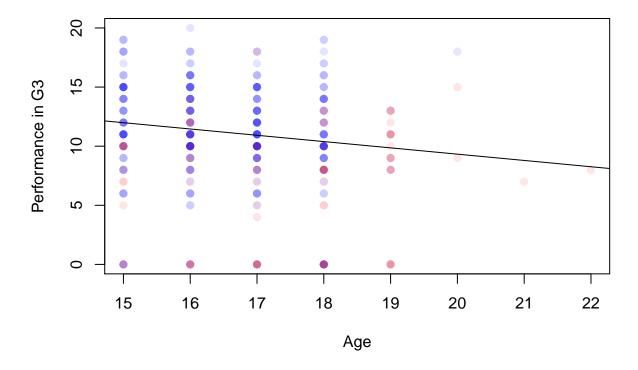
```
with(student.mat, summary(aov(G3 ~ age + failures + age*failures)))
```

```
##
                Df Sum Sq Mean Sq F value
                                            Pr(>F)
## age
                 1
                       216
                             215.9 11.976 0.000598 ***
                      906
                            906.2 50.261 6.33e-12 ***
## failures
                 1
## age:failures
                       98
                             98.4
                                    5.458 0.019986 *
                 1
## Residuals
                             18.0
               391
                     7049
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

The results show that all factors are significant. The older a person was and the more failures a person experienced, the more will the performance decrease. Finally, I plot the results:

Warning in abline($lm(G3 \sim age + failures + age * failures)$): only using the ## first two of 4 regression coefficients

Relationship between age and performance

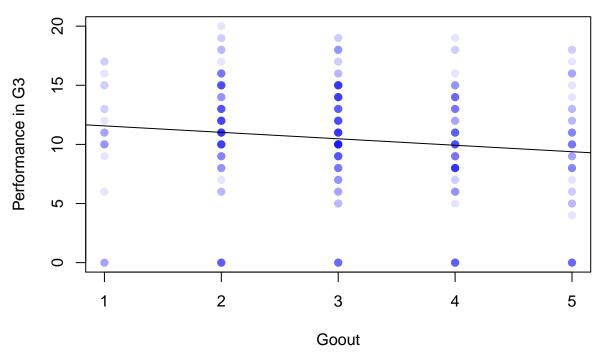


4. Relationship between goout and performance

with(student.mat, abline(lm(G3 ~ goout)))

```
lm1 <- with(student.mat, summary(lm(G3 ~ goout )))</pre>
lm1
##
## Call:
## lm(formula = G3 ~ goout)
##
## Residuals:
                1Q Median
                                    3Q
##
       Min
                                            Max
## -11.5676 -1.9282 0.4324 3.0718
                                       9.0718
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 12.1141 0.6793 17.833 < 2e-16 ***
                           0.2057 -2.656 0.00823 **
## goout
              -0.5465
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 4.547 on 393 degrees of freedom
## Multiple R-squared: 0.01763,
                                   Adjusted R-squared: 0.01513
## F-statistic: 7.054 on 1 and 393 DF, p-value: 0.008229
Going out is significantly related to the performance in the math course. I want to visualize this with a
scatter plot:
plot(1,
    xlim = c(1, 5),
    ylim = c(0, 20),
    type = "n",
    main = "Relationship between goout and performance",
    xlab = "Goout",
     ylab = "Performance in G3"
with(student.mat,
    points(goout,
            G3,
           pch = 21,
           col = alpha("blue", 0.1),
            bg =alpha("blue", 0.1)
```

Relationship between goout and performance



After checking the plot I realized that the mean of the performance is low when the child is rarely going out. This is why I assumed another coherence. At first, I checked for the means:

```
aggregate(
  formula = G3 ~ goout,
  data= student.mat,
  FUN = mean)
```

```
## 1 goout G3
## 1 1 9.869565
## 2 2 11.194175
## 3 3 10.961538
## 4 4 9.651163
## 5 5 9.037736
```

The means reveal what I assumed. The first mean is lower than the second or third one. Finally, I expected the relationship between performance and going out to be quadratic. I checked this with a regression analysis.

Conclusion

In comparison to that the result that going out is negatively correlated with your performance in a Math Class is totally intuitive. Additionally, the results revealed that older children which failed once or several times have lower performance rates.

While boys show lower performances when they grow older, girls remain relatively constant.