## Technical University of Denmark

Page 1 of 35 pages.
Written examination: 30. May 2021
Course name and number: Introduction to Statistics (02402)
Duration: 4 hours
Aids and facilities allowed: All
The questions were answered by

$$
\overline{\text { (student number) }}
$$

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\overline{\text { (signature) }}
$$

(table number)
This exam consists of 30 questions of the "multiple choice" type, which are divided between 11 exercises. To answer the questions, you need to fill in the "multiple choice" form ( 6 separate pages) on CampusNet with the numbers of the answers that you believe to be correct.

5 points are given for a correct "multiple choice" answer, and -1 point is given for a wrong answer. ONLY the following 5 answer options are valid: $1,2,3,4$, or 5 . If a question is left blank or an invalid answer is entered, 0 points are given for the question. Furthermore, if more than one answer option is selected for a single question, which is in fact technically possible in the online system, 0 points are given for the question. The number of points needed to obtain a specific mark or to pass the exam is ultimately determined during censoring.

The final answers should be given by filling in and submitting the form online via CampusNet. The table provided here is ONLY an emergency alternative. Remember to provide your student number if you do hand in on paper.

| Exercise | I.1 | II.1 | II.2 | II.3 | III.1 | III.2 | III.3 | III.4 | III.5 | IV.1 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Question | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | $(7)$ | $(8)$ | $(9)$ | $(10)$ |
| Answer | 3 | 4 | 3 | 1 | 4 | 1 | 2 |  |  |  |
|  | 3 | 4 | 3 | 1 | 4 | 1 | 2 | 5 | 1 | 5 |


| Exercise | IV.2 | IV.3 | V.1 | V.2 | V.3 | VI.1 | VI.2 | VI.3 | VII.1 | VII.2 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Question | $(11)$ | $(12)$ | $(13)$ | $(14)$ | $(15)$ | $(16)$ | $(17)$ | $(18)$ | $(19)$ | $(20)$ |
| Answer |  |  |  |  |  |  |  |  |  |  |
|  | 5 | 3 | 2 | 2 | 3 | 5 | 1 | 3 | 1 | 3 |


| Exercise | VIII.1 | VIII.2 | VIII.3 | IX.1 | IX.2 | X.1 | X.2 | X.3 | XI.1 | XI.2 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Question | $(21)$ | $(22)$ | $(23)$ | $(24)$ | $(25)$ | $(26)$ | $(27)$ | $(28)$ | $(29)$ | $(30)$ |
| Answer |  |  |  |  |  |  |  |  |  |  |
|  | 5 | 4 | 3 | 2 | 5 | 4 | 2 | 4 | 4 | 5 |

The exam paper contains 35 pages.
Continue on page 2

Multiple choice questions: Note that in each question, one and only one of the answer options is correct. Furthermore, not all the suggested answers are necessarily meaningful. Always remember to round your own result to the number of decimals given in the answer options before you choose your answer. Also remember that there may be slight discrepancies between the result of the book's formulas and corresponding built-in functions in $R$.

## Exercise I

The incidence of occupational disease in an industry is such that the workers have a $20 \%$ chance of suffering from it.

## Question I. 1 (1)

What is the probability that out of 6 randomly selected workers 4 or more will contract disease?

10.000064

20.01536
$3^{*}$0.01696

40.90112

50.9984

This a binomial experiment and we get the probability by:
1-pbinom(3, size=6, prob $=0.2$ )
\#\# [1] 0.01696

## Exercise II

In a study three new products were tested to compare the user experience of each. The products were named "A", "B" and "C". Prototypes of each product were randomly send to testers, and they reported back their experiences with the product in an interview. Their responses were rated according to how much they liked the product - and counted into one of three categories: "Low", "Medium", "High". The results were read into R by:

```
mat <- matrix(c(24, 21, 14,
    12, 15, 22,
    15, 26, 24), ncol = 3, byrow = TRUE)
colnames(mat) <- c("Low", "Medium","High")
rownames(mat) <- c("A","B","C")
```

and presented in a table:

|  | Low | Medium | High |
| :--- | ---: | ---: | ---: |
| A | 24 | 21 | 14 |
| B | 12 | 15 | 22 |
| C | 15 | 26 | 24 |

Researchers want to test if the three products are rated significantly different. Hence the following null hypothesis must be tested

$$
H_{0}: p_{i, 1}=p_{i, 2}=p_{i, 3} \text { for } i=1,2,3
$$

where $p_{i, j}$ denotes the proportion in row $i$ and column $j$.

## Question II. 1 (2)

What is the expected value of counts in the "Medium" rating category for product " B " under the null hypothesis?

10.087

215.0

316.3

4*17.6

519.1

We are given the code to read the data in R , so the easiest is:

```
# Write the table in R
mat
## Low Medium High
## A 24 21 14
## B 12 15 22
## C 15 26 24
# The number of observations
(n <- sum(mat))
## [1] 173
# The expected counts under HO
fit$expected["B","Medium"]
## [1] 17.6
# or
margin.table(mat, 1)["B"] * margin.table(mat, 2)["Medium"] / n
## B
## 17.6
```


## FACIT-END

Question II. 2 (3)
What is the outcome of the test of the null hypothesis on a $5 \%$ significance level (both conclusion and argument must be correct)?

1The $p$-value is below the significance level, hence the null hypothesis is accepted.

2The $p$-value is below the significance level, hence the null hypothesis is rejected.

3*The $p$-value is above the significance level, hence the null hypothesis is accepted.

4The $p$-value is above the significance level, hence the null hypothesis is rejected.

There has not been provided enough information to calculate the $p$-value and make the conclusion.

Again, since we have the code for reading data into $R$, it's easiest to:

```
fit <- chisq.test(mat, correct=FALSE)
fit
##
## Pearson's Chi-squared test
##
## data: mat
## X-squared = 8, df = 4, p-value = 0.09
```

The $p$-value is above the significance level, so the null hypothesis is accepted.

```
FACIT-END
```


## Question II. 3 (4)

In this question we only consider observations for product "A":

| Low | Medium | High |
| ---: | ---: | ---: |
| 24 | 21 | 14 |

what is the $98 \%$ confidence interval for the proportion of "Low" ratings for product "A" (Note that, the result from relevant R function is slightly different from the correct answer, when rounded it's within $\pm 0.01$ )?

1* $\square$ [0.26, 0.56]

2 $\square$ [0.32, 0.81]
$3 \square$ [0.37, 0.76]

4[0.49, 0.83]

5[0.52, 0.81]

We need to just consider part of the data, we easily do this not using R :

```
(x <- mat["A","Low"])
## [1] 24
(n <- sum(mat["A", ]))
## [1] 59
```

and then we can calculate the interval, either using the formula:

```
# Using the formula from the book
(pha <- x / n)
## [1] 0.407
pha + c(-1,1) * qnorm(0.99) *(sqrt(pha*(1-pha)/n))
## [1] 0.258 0.556
```

or using the function:

```
# or using the function
prop.test(x, n, conf.level = 0.98, correct=FALSE)
##
## 1-sample proportions test without continuity correction
##
## data: x out of n, null probability 0.5
## X-squared = 2, df = 1, p-value = 0.2
## alternative hypothesis: true p is not equal to 0.5
## 98 percent confidence interval:
## 0.272 0.557
## sample estimates:
## p
## 0.407
```


## Exercise III

In the process of curing of concrete, the temperature inside the concrete will increase rapidly for a period of time due to chemical processes. After the increase the temperature will decrease until the temperature of the surroundings is reached. The strength of the concrete can be assessed from the temperature profile (i.e. how the temperature increased and decreased).

In the R-code below x1 represents the change in temperature inside the concrete from the beginning of an hour to the end of the hour, on Day 3 after the cast began:

```
t.test(x1)
##
## One Sample t-test
##
## data: x1
## t = -4.1246, df = 21, p-value = 0.0004823
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## -0.10939584 -0.03605871
## sample estimates:
## mean of x
## -0.07272727
```

In the questions below it can be assumed that the observations are from a normal distribution with expectation $\mu_{1}$ and variance $\sigma_{1}^{2}$, furthermore it may be assumed that the observations are independent.

## Question III. 1 (5)

Based on the R-output above and using significance level $\alpha=0.05$, can it be concluded that the temperature is decreasing, corresponding to $\mu_{1}<0$ (both the conclusion and the argument must be correct)?

1Yes, since $0.00048<0.05$
$2 \square$ $\square$ Yes, since $-0.073<0$

3No, since $0.073>0.05$
4*Yes, since $-0.036<0$

5No, since $-4.12<0$

Out of the five answer only one of them contains the correct answer and fulfilling argument. The $p$-value of $H_{0}: \mu_{1} \neq 0$ is 0.00048 , so we reject that it is equal to zero, however it's not enough argument to conclude that $\mu_{1}$ is below zero. The argument $-0.036<0$ is fulfilling, since -0.036 is the upper limit of the $95 \%$ confidence interval, hence when zero is not included in the interval, and the interval is below zero, then it's a sufficient argument to conclude that $\mu_{1} \neq 0$.

In the R-code below x2 represents the hourly temperature differences on Day 4 after the cast:

```
mean(x2)
## [1] -0.1181818
sd(x2)
## [1] 0.05884899
length(x2)
## [1] 22
```

It can be assumed that the observations are normal and independent, with mean $\mu_{2}$ and variance $\sigma_{2}^{2}$.

Question III. 2 (6)
$\mu_{2}$ represents the expected value on the Day 4, what is the $95 \%$ confidence interval for $\mu_{2}$ ?

1*[-0.144, -0.092]

2[-0.140, -0.0966]

3$[-0.135,-0.101]$

4[ $-0.124,-0.113]$

5$[-0.120,-0.117]$

We take the values for x 2 given above and insert them in the one-sample confidence interval formula: Equation 3-10.

## Question III. 3 (7)

$\sigma_{2}^{2}$ represents the variance on the Day 4, what is the $95 \%$ confidence interval for the standard deviation $\sigma_{2}$ ?

1[0.0472, 0.0792]

2*[0.0453, 0.0841]

3[0.0348, 0.120]

4[0.00266, 0.00495]

5[0.00205, 0.00707]

## FACIT-BEGIN

We use the formula for the confidence interval for the standard deviation with the values given above for x 2 . It's the second formula in Method 3.19.

## FACIT-END

Question III. 4 (8)
Assuming equal variance in the two groups, what is the usual test statistics for the test $H_{0}$ : $\mu_{1}=\mu_{2}$ against the two-sided alternative?
$1 \square$
3.62

21.81

32.58

41.78

5*2.10

## FACIT-BEGIN

This is a bit tricky question, because calculating the answer takes a couple of steps. We want to use Method 3.53, so we need to first find pooled variance estimate. We have to find the mean and standard deviation of the two samples.

For x 1 we have to rearrange the confidence interval formula (Equation 3-10) and use the result from t.test given in the beginning of the Exercise:

```
s1 <- (0.10939584 - 0.03605871)/(2*qt(0.975,df=21))*sqrt(22)
m1 <- -0.07272727
```

For x2 we have it:

```
s2 <- 0.05884899
m2 <- -0.1181818
```

Then we can insert that to get the answer:

```
s <- sqrt((21*s1^2 + 21*s2^2)/(44-2))
(m1-m2)/(s*sqrt(1/22+1/22))
## [1] 2.100419
```

Question III. 5 (9)
Using the standard deviation from Day 4, and significance level $\alpha=0.05$ how many observations would be needed to detect a mean of -0.05 (when using the null hypothesis that the slope is zero), if the required power is 0.9 (the correct answer is calculated using the formula in the book)?


We use Method 3.65,

```
(s2 * (qnorm(0.9)+qnorm(0.975)) / (0.05))^2
## [1] 14.55574
# or with the R function (giving a slightly higher number because it uses the t-distr
power.t.test(delta=-0.05, sd=s2, sig.level=0.05, power=0.9, type="one.sample")
##
## One-sample t test power calculation
##
```

```
##
##
##
        delta = 0.05
                sd = 0.05884899
        sig.level = 0.05
        power = 0.9
        alternative = two.sided
```


## Exercise IV

Yearly measurements of temperature (in ${ }^{\circ} \mathrm{C}$ ) for a region of northern Italy were collected in the years 1984-2005. The data was read into R:

```
temperature <- c(8.43, 7.89, 8.28, 7.84, 9.62, 9.41, 9.40, 8.22, 9.18, 9.17,
    9.25, 9.68, 8.49, 8.53, 9.30, 8.94, 9.46, 9.69, 9.37, 9.42,
    9.13, 9.18)
year <- 1984:2005
```

and a linear regression was carried out on the data:

```
##
## Call:
## lm(formula = temperature ~ year)
##
## Residuals:
## Min 1Q Median 3Q Max
## -0.80872 -0.31761 0.03158 0.29517 0.92517
##
## Coefficients:
## Estimate Std. Error t value Pr (>|t|)
## (Intercept) -82.97094 33.74565 -2.459 0.0232 *
## year 0.04611 0.01692 2.725 0.0130*
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.5035 on 20 degrees of freedom
## Multiple R-squared: 0.2708,Adjusted R-squared: 0.2343
## F-statistic: 7.427 on 1 and 20 DF, p-value: 0.01304
```


## Question IV. 1 (10)

What is the estimate for the expected temperature increase over 10 years?

1$0.046{ }^{\circ} \mathrm{C}$

2$-8.2{ }^{\circ} \mathrm{C}$

3$0.017{ }^{\circ} \mathrm{C}$

4$2.7 \%$

5* $\qquad$ $0.46{ }^{\circ} \mathrm{C}$

The annual increase is 0.046 . Multiply by 10 to get $0.46{ }^{\circ} \mathrm{C}$.

## Question IV. 2 (11)

The plots below show a residual plot and a normal q-q plot of the residuals:


Which of the following statements is the correct interpretation of the two plots?

We see no linear tendency in the residual plot. This is evidence for the null hypothesis of no significant effect of time on temperature.

2The residual plot looks (reasonably) fine, but the q-q plot looks questionable. This indicates a problem with the normality assumption.

3The residual plot looks (reasonably) fine, but the q-q plot looks questionable. This indicates a problem with the linear dependence assumption.

4Both plots look questionable. This indicates problems with the linear dependence assumption and the normailty assumption.

5*Both the residual plot and the q-q plot look (reasonably) fine and this confirms the validity of the model.

Both q-q plot and residual plot look fine, see Section 5.7.

## Question IV. 3 (12)

Suppose the temperature for the same region in 2017 was $10.91{ }^{\circ} \mathrm{C}$. Which of the following statements is a correct (both argument and conclusion must be correct)?
$1 \square$ The $95 \%$ confidence interval is $[8.21,9.86]$. The observation fits reasonably well with the model.
$2 \square$ The $95 \%$ confidence interval is $[8.21,9.86]$. The observation does not fit well with the model.

3*The $95 \%$ prediction interval is $[8.70,11.37]$. The observation fits reasonably well with the model. The $95 \%$ prediction interval is $[8.70,11.37]$. The observation does not fit well with the model.

5None of the above statements are correct.

## FACIT-BEGIN

Either use the prediction interval formula in Equation $5-60$ or use the predict function in R, e.g.

```
predict(lm(temperature ~ year), newdata = data.frame(year = 2017), interval = "predicti
## fit lwr upr
## 1 10.03201 8.696461 11.36756
```

Since the observation is inside the prediction interval, it is reasonable to say that the observation fits well with the model.

## Exercise V

In order to understand why it can be hard to live in Denmark during the dark times in the winter, an analysis was carried out. From the Danish Meteorological Institute the sunlight arriving during December and January, at the Isenvad station in mid-Jutland, was obtained for 10 years. From the data the longest period with no registered sunlight was calculated for each winter:

|  | 2010 | 2011 | 2012 | 2013 | 2014 | 2015 | 2016 | 2017 | 2018 | 2019 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Period length in days | 3.7 | 1.9 | 4.8 | 11.7 | 2.8 | 4.7 | 2.7 | 4.9 | 6.7 | 3.8 |

## Question V. 1 (13)

What is the median of the sample?
$1 \square$ 3.8

2*4.25

34.7

44.77

54.875

## FACIT-BEGIN

Sort the observations and then, since there is an equal number, take the average of the two observations in the middle. If the values were written into $R$ :

```
median(x)
## [1] 4.25
```

```
FACIT-END
```


## Question V. 2 (14)

One wants to estimate a $90 \%$ confidence interval for the mean of the longest period without sunshine in Isenvad during the years. The sample is stored in the vector x . Which of the following code snippets calculates the confidence interval without any assumption of distribution?

1 $\square$
simsamples <- replicate(10000, sample(x, replace = FALSE))
quantile(apply(simsamples, 2, mean), c(0.025, 0.975))

2*
simsamples <- replicate(10000, sample(x, replace $=$ TRUE))
quantile(apply(simsamples, 2 , mean), c(0.05, 0.95))

3 $\square$ simsamples <- replicate(10000, sample(x, replace = FALSE)) quantile(apply(simsamples, 2 , median), c(0.025, 0.975))

4 t.test (x, conf.level=0.9)

5t.test(x, conf.level=0.95)

## FACIT-BEGIN

It cannot be with the $t$. test function, since that would require an assumption of normal distribution (although if we have $n>30$ observations the CLT will make t.test result ok without normal dist.).

So it has to be with bootstrapping, and we can rule out the answer with median and the answer with replace $=$ FALSE. So only one answer is left:

```
simsamples <- replicate(10000, sample(x, replace = TRUE))
quantile(apply(simsamples, 2, mean), c(0.05, 0.95))
## 5% 95%
## 3.53 6.25
```


## FACIT-END

## Question V. 3 (15)

Furthermore, an analysis was carried out where the sunlight in Isenvad in the middle of Jutland, was compared to the sunlight, in Hvide Sande at the west coast of Jutland. The number of days with no registered sunlight during December and January at each location, for each of the same 10 years was calculated. The observations are summarized in the following boxplot:


The observations are sorted according to the year and for Isenvad stored in x and for Hvide Sande in y:

|  | 2011 | 2012 | 2013 | 2014 | 2015 | 2016 | 2017 | 2018 | 2019 | 2020 |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| x | 9 | 13 | 18 | 29 | 19 | 22 | 13 | 22 | 26 | 21 |
| y | 9 | 12 | 13 | 23 | 17 | 22 | 15 | 17 | 22 | 16 |

The following R code was executed:

```
mean(x)
## [1] 19.2
mean(y)
## [1] 16.6
k <- 10000
simxsamples <- replicate(k, sample(x, replace = TRUE))
simysamples <- replicate(k, sample(y, replace = TRUE))
sim1 <- apply(simxsamples, 2, mean) - apply(simysamples, 2, mean)
simsamples <- replicate(10000, sample(x-y, replace = TRUE))
sim2 <- apply(simsamples, 2, mean)
quantile(sim1, c(0.005, 0.995))
## 0.5% 99.5%
## -3.5 8.7
```

```
quantile(sim2, c(0.005, 0.995))
## 0.5% 99.5%
## 0.4 4.6
```

Which of the following statements is correct (both conclusion and argument must be correct)?
$1 \square$Two parametric bootstrapping $99 \%$ confidence intervals were calculated.At a $5 \%$ significance level it cannot be concluded that there is a significant difference between the number of days with no sunlight for the two locations.
$\square$ At a $5 \%$ significance level it can be concluded that there is a significant difference between the number of days with no sunlight for the two locations.
$4 \square$The sample mean for Isenvad is lower than for Hvide Sande.

5None of the above statements are correct.

We have to use the result of sim2, since it's the samples can be paired on the year, so we do the calculations as one-sample on the differences between each year. Since the $99 \%$ confidence interval does not contain zero, then the $95 \%$ confidence interval (which is always narrower) will also not contain zero.

## Exercise VI

A family is looking for a summer house. They really love summer and sunshine, and will mostly use the summer house in July. Therefore they downloaded data of sunlight hours observed at Hvide Sande located at the west coast of Jutland, and similarly at Hammer Odde located at Bornholm. They have taken the difference in sunlight hours between the two locations for each day during the last 10 years in July.

Let the $i$ 'th observed difference in hours be represented by $x_{i}$, such that $x_{i}>0$ implies that there was more sunlight at Bornholm compared to the west coast of Jutland.

They decide to restrict their search for a summer house to the location with more sunlight hours, if a statistical test can reveal statistical evidence of a difference between the locations at a significance level of $5 \%$. The values are saved in the vector x in R and following result was obtained:

```
t.test(x)
##
## One Sample t-test
##
## data: x
## t = 4.722, df = 278, p-value = 3.708e-06
## alternative hypothesis: true mean is not equal to 0
## 95 percent confidence interval:
## 2.150853 5.226247
```


## Question VI. 1 (16)

How many observations were included in the analysed sample?

1
$n=9$

2$n=10$

3$n=11$

4$n=278$

5*$n=279$

We read off the degrees of freedom in the result to $d f=278$ and we know that for the one-sample $t$-test carried out $d f=n-1$, so $n=d f+1=279$.

## Question VI. 2 (17)

What does the family conclude based on the result (both argument and location decision must be correct)?

1* $\square$ There is strong evidence against $H_{0}: \mu_{X}=0$, leading them to only search for a summer house at Bornholm.
$2 \square$ There is strong evidence against $H_{0}: \mu_{X}=0$, leading them to only search for a summer house at the west coast of Jutland.
$3 \square$ There is weak evidence against $H_{0}: \mu_{X}=0$, leading them to only search for a summer house at Bornholm. There is weak evidence against $H_{0}: \mu_{X}=0$, leading them to only search for a summer house at the west coast of Jutland. There is litte or no evidence against $H_{0}: \mu_{X}=0$, leading to them search for a summer house at both locations.

## FACIT-BEGIN

Using Table 3.1 and the $p$-value in the result the family conclude that there are strong evidence against $H_{0}: \mu_{X}=0$ and since the estimated mean is above zero, then it leads them to conclude that the there is more sunlight at Bornholm - thus they will search for a summerhouse only there.

## FACIT-END

## Question VI. 3 (18)

Which of the following statements regarding the sample mean of x is correct?

1The sample mean is 2.613 .

2The sample mean is 3.075 .

3*The sample mean is 3.689 .The sample mean is 4.722 .
$5 \square$ Not enough information has been given to calculate the sample mean.

It's simply the middle of the confidence interval:
$2.150853+(5.226247-2.150853) * 0.5$
\#\# [1] 3.68855
mean ( x )
\#\# [1] 3.68855

FACIT-END

Continue on page 23

## Exercise VII

Customers at a bank arrive at random and independently; the probability of an arrival in any 1-minute period is the same as the probability of an arrival in any other 1-minute period. Answer the following questions, assuming a mean arrival rate of three customers per minute.

## Question VII. 1 (19)

What is the probability of exactly three customers arriving in a randomly selected 1-minute period?

1*0.2240
$2 \square$0.4232

30.5768

40.6472

50.7760

We must use the Poisson distribution and the probability for exactly three costumers arriving is given by the pdf:

```
dpois(3,3)
## [1] 0.2240418
```


## Question VII. 2 (20)

What is the probability of at least three arrivals in a randomly selected 1-minute period?

10.2240

20.4232

3*0.5768

40.6472

50.7760

We must have at least three or above, so $P(X \geq 3)=1-P(X<2)$, so:
1- ppois(2, lambda=3)
\#\# [1] 0.5768099
?ppois

## Exercise VIII

Consider the random variable $X$ that represents the flight time (in minutes) of an airplane traveling from Chicago to New York. The probability density function for $X$ is

$$
f(x)= \begin{cases}1 / 20 & 120 \leq x \leq 140 \\ 0 & \text { otherwise }\end{cases}
$$

which is plotted below:


Question VIII. 1 (21)
What is the probability of a flight time between 120 and $140 \mathrm{~min} ?$

10.2

20.5
$3 \square$ 0.8

40.9

5* 1.0

It's the uniform distribution from 120 to 140 , so the entire interval and the probability is therefore 1 .

## Question VIII. 2 (22)

What is the standard deviation of $X$ ?

1
1.67

2 3.33

34.47

4*5.77

533.33

Use the formula for the variance of a uniform distribution in Method 2.36.

## FACIT-END

## Question VIII. 3 (23)

If a random sample of $n=36$ observations was taken of the flight times, which of the following plots would then represent a good approximation of the probability density function (pdf) of the sample mean $\bar{X}$ ?


1Plot A
2Plot B
3*Plot C
4Plot D

5None of the plots can be a good approximation to the pdf of the sample mean $\bar{X}$.

## FACIT-BEGIN

We know that the sample mean is approximated well with a normal distribution with mean $\mu_{X}$ and variance $\sigma_{X}^{2} / n$, which follows from the CLT in Theorem 3.14.

Since it's a uniform distribution we use Theorem 2.36 to obtain the mean of $X$

$$
\mu_{X}=130
$$

and the standard deviation of $X$

$$
\sigma_{X}=\sqrt{\sigma_{X}}=\sqrt{33.33}=5.77
$$

So we find the plot of a normal distribution with mean 130 and standard deviation

$$
\sigma_{\bar{X}}=\sigma_{X} / \sqrt{n}=5.77 / 6=0.96
$$

(remember that roughly three times the standard deviations from the mean, the normal pdf is down at zero).

## Exercise IX

We observed two variables, $y$ and $x_{1}$, and carried out a linear regression:

```
summary(lm(y ~ x1))
##
## Call:
## lm(formula = y ~ x1)
##
## Residuals:
\begin{tabular}{lrrrrr} 
\#\# & Min & 1Q & Median & 3Q & Max \\
\#\# & -0.44978 & -0.20443 & -0.12711 & 0.00835 & 1.11002
\end{tabular}
##
## Coefficients:
## Estimate Std. Error t value Pr(>|t|)
## (Intercept) -1.5178 0.1456 -10.43 6.21e-06 ***
## x1 0.4161 0.1547 2.69 0.0275 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.4563 on 8 degrees of freedom
## Multiple R-squared: 0.4749,Adjusted R-squared: 0.4092
## F-statistic: 7.234 on 1 and 8 DF, p-value: 0.02751
```


## Question IX. 1 (24)

Which of the following statements is correct regarding the output line (intercept) in the lm result? The Std. Error expresses the uncertainty on the estimate of the regression slope.
$2^{*} \square \quad$ The Std. Error expresses the uncertainty on the expected value of an observation, where $x_{1}=0$.

3The $t$-value can be used to assess if there is a significant association between $x_{1}$ and $y$.

4The $t$-value is a measure of model validity. A small $t$-value indicates a valid model.
$5 \square$Neither the Std. Error nor the $t$-value are related to the uncertainty of the model.

## FACIT-BEGIN

The expected value of a new observation is the same as the confidence interval for the line, as stated in text above Method 5.18: "confidence intervals, where we predict the mean value of future outcomes".

Checking the formula for the standard error of the intercept $\beta_{0}$ in Equation 5-43, with the formula for the confidence interval for the line in Equation 5-59, we can see that with $x_{\text {new }}=0$ it's the same expression for the standard error.

One can also exclude the other answers and see that the only reasonable answer is option 2, so even without getting the detail about the expected value, it's possible to find the correct answer.

Option 1 and 3 are correct for x 1 , not for the intercept.

## FACIT-END

## Question IX. 2 (25)

Suppose we included an additional variable $x_{2}$ to our model, i.e. $Y_{i}=\beta_{0}+\beta_{1} x_{1, i}+\beta_{2} x_{2, i}+\epsilon_{i}$.

Which of the following statements is correct?

1The explained variance $r^{2}$ (Multiple R-squared in the result) will decrease compared to the model with only $x_{1}$.

2
$\square$ If we were to perform backward selection with significance level $\alpha=0.05$, we would remove $x_{2}$ if the corresponding $p$-value in the result is 0.0275 .
$3 \square$ At most one of $x_{1}$ and $x_{2}$ will be significant on a $5 \%$ level.
4At least one of $x_{1}$ and $x_{2}$ will be significant on a $5 \%$ level.

5* $\square$ Each statement above is either not correct, or we have insufficient information conclude if it is.

## FACIT-BEGIN

The explained variance always increases if more variables are included. This rules out option 1. If $x_{1}$ are $x_{2}$ are (sufficiently) collinear, it may happen that none of them are significant. This rules out option 4. Potentially, there is an effect of $x_{2}$ in addition to that of $x_{1}$. This rules out option 3. The p-values usually change when more variables are included. This rules out option 2.

In conclusion, option 5 is the correct answer.

## Exercise X

As part of a multilab study, three fabrics were tested for flammability at the National Bureau of Standards. The following burn times in minutes were recorded after a paper tab was ignited on the hem of a dress made of each fabric:

| Fabric1 | Fabric2 | Fabric3 |
| ---: | ---: | ---: |
| 3.11 | 3.43 | 2.56 |
| 3.09 | 4.03 | 3.14 |
| 2.67 | 3.54 | 3.11 |
| 2.66 | 3.24 | 1.69 |
| 2.16 | 3.77 | 1.91 |
| 3.22 | 3.86 | 2.62 |
| 3.28 | 3.39 | 3.25 |

A one-way analysis of variance (ANOVA) was carried out. The resulting ANOVA table can be seen below (some elements has been substituted with question marks):

|  | Df | Sum Sq | Mean Sq | F value | $\operatorname{Pr}(>\mathrm{F})$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Fabric | $?$ | 3.71 | $?$ | 8.91 | 0.0020 |
| Residuals | $?$ | 3.75 | $?$ |  |  |

## Question X. 1 (26)

Which of the following statements is correct?
$1 \square$For Residuals: $\mathrm{Df}=21$ and Mean $\mathrm{Sq}=0.18$

2For Residuals: $\mathrm{Df}=20$ and Mean $\mathrm{Sq}=0.19$

3For Residuals: $\mathrm{Df}=19$ and Mean $\mathrm{Sq}=0.20$

4*For Residuals: $\mathrm{Df}=18$ and Mean $\mathrm{Sq}=0.21$

5For Fabric: $\mathrm{Df}=3$ and Mean $\mathrm{Sq}=1.237$

## FACIT-BEGIN

The number of observations was $n=21$. Therefore, the total number of degrees of freedom was $n-1=20$. The number of degrees of freedom for Fabric is given by $k-1=2$. The number of degrees of freedom for the residuals is given by $(n-1)-(k-1)=18$. The residual variance can be calculated by dividing the Sum Sq with Df. Given the information provided above only answer 4 can be correct.

## FACIT-END

## Question X. 2 (27)

The flammability study was repeated for four other types of fabric. The results are shown in the boxplot:


A one-way ANOVA was carried out. The result is presented in the ANOVA table below (the values are as usual rounded):

|  | Df | Sum Sq | Mean Sq | F value | $\operatorname{Pr}(>\mathrm{F})$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Fabric | 3 | 13.82 | 4.61 | 43.20 | 0.0000 |
| Residuals | 76 | 8.10 | 0.11 |  |  |

What would be the estimate for the variance in burn time, if all data were considered as one sample from a single population?

1$\hat{\sigma}^{2}=\frac{13.82}{3}+\frac{8.10}{76}$

2*$\hat{\sigma}^{2}=\frac{13.82+8.10}{79}$
$3 \square$ $\square \quad \hat{\sigma}^{2}=4.61+0.11$

4$\hat{\sigma}^{2}=\frac{4.61}{3}+\frac{0.11}{76}$

5We are not given sufficient information to calculate the variance estimate.

ANOVA decomposes the total Sum of Squares $(S S T)$, such that $S S T=S S(T r)+S S E$. We can extract $S S(T r)$ and $S S E$ from the ANOVA table above to find SST. The requested variance estimate can be calculated using the formula in Equation 8-10 and get $\hat{\sigma}^{2}=\frac{S S T}{n-1}$ with $d f($ total $)=n-1=d f($ Fabric $)+d f($ Residuals $)=76+3=79$.

## FACIT-END

## Question X. 3 (28)

Look at the ANOVA table from the previous question. We want to test the following hypothesis:

$$
H_{0}: \mu_{\text {Fabric1 }}=\mu_{\text {Fabric2 }}=\mu_{\text {Fabric3 }}=\mu_{\text {Fabric4 }}=\mu
$$

Assuming a significance level $\alpha=0.05$, which R command results in the correct critical value in the $F$-distribution to be used for the hypothesis test?

1$\mathrm{pf}(0.05,3,76)$

2pf (0.95, 3, 76)
$3 \square$ pf $(0.975,3,79)$

4*qf $(0.95,3,76)$

5qf (0.975, 3, 76)

## FACIT-BEGIN

It must be qf to get a quantile from the $F$-distribution, and have $d f_{1}=k-1$ and $d f_{2}=n-k$, where $k$ is the number of groups.

## Exercise XI

One is interested in examining the impact of four different teaching methods (A-D) with respect to student performance. A randomized block design was utilized, meaning that three students underwent all four teaching methods including corresponding examination in randomized order. The following data was gathered, where the best possible exam performance is 100 (percent):

|  | Student1 | Student2 | Student3 |
| :--- | ---: | ---: | ---: |
| A | 84 | 89 | 91 |
| B | 85 | 87 | 91 |
| C | 85 | 88 | 89 |
| D | 86 | 90 | 96 |

A two-way ANOVA with significance level $\alpha=0.05$ was carried out to investigate if teaching method had a significant impact on student performance. The ANOVA table can be seen below. Some elements have been replaced by question marks:

|  | Df | Sum Sq | Mean Sq | F value | $\operatorname{Pr}(>\mathrm{F})$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Student | 2 | 91.17 | 45.583 | 21.312 | 0.002 |
| Method | 3 | 20.92 | $?$ | $?$ | $?$ |
| Residuals | 6 | 12.83 | 2.139 |  |  |

## Question XI. 1 (29)

Which of the following statements is correct?
$1 \square$ The $p$-value for Method is 0.56 and there is no significant effect of teaching method.The $p$-value for Method is 0.18 and there is a significant effect of teaching method.
$3 \square$ The $p$-value for Method is 0.18 and there is no significant effect of teaching method.
$4^{*}$The $p$-value for Method is 0.10 and there is no significant effect of teaching method.The $p$-value for Method is 0.10 and there is a significant effect of teaching method.

## FACIT-BEGIN

We can calculate $M S($ Method $)=\frac{S S(\text { Method })}{D f(\text { Method })}$ and $F($ Method $)=\frac{M S(\text { Method })}{M S(\text { Residuals })}$. We are interested in finding the $p$-value which represents the probability of obtaining an $F$-test statistic, which is at least as extreme as the observed (under the assumption that the Null hypothesis is true). We can find the $p$-value using the following R command:
$1-\operatorname{pf}(20.92 /(3 * 2.14), 3,6) \approx 0.10$
The $p$-value is greater than 0.05 , hence the there is no significant impact of teaching method.

## Question XI. 2 (30)

The ANOVA above indicates that there is a significant difference between student performance. We are now planning post-hoc tests for pairwise comparison of the student performance means. In order not to increase the risk of making a Type-I error we would like to correct our significance level $\alpha$ using Bonferroni correction.

Which of the following statements is correct?
$1 \square$ We are performing 12 post-hoc test, hence we must divide $\alpha$ by 12 .
$2 \square$ We are performing 12 post-hoc test, hence we must divide $\alpha$ by 11 .
$3 \square$ We are performing 4 post-hoc test, hence we must divide $\alpha$ by 4 .
$4 \square$ $\square$ We are performing 3 post-hoc test, hence we must divide $\alpha$ by 2 .

5*We are performing 3 post-hoc test, hence we must divide $\alpha$ by 3 .

## FACIT-BEGIN

We are aiming at comparing the 3 student performance means. Hence, we must carry our 3 post-hoc hypothesis tests. Bonferroni correction makes sure that the family wise Type-I risk does not inflate by dividing $\alpha$ by the number of hypothesis tests carried out. Therefore only answer 5 is correct.

## FACIT-END

The exam is finished. Enjoy the summer!

