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## INFO-F422 - Statistical foundations of machine learning - 202122

Commencé le	dimanche 5 juin 2022, 11:23
État	Terminé
Terminé le	dimanche 5 juin 2022, 12:00
Temps mis	36 min 18 s
Note	6,83 sur 20,00 (34%)

Question 1  
Non répondu  
Note sur 1,00  
V Marquer la question

Let  $\mathbf{x}$  and  $\mathbf{y}$  two discrete dependent r.v.s.  
The domain of  $\mathbf{x}$  is  $\{-1, 0, 1\}$  and its probability distribution is uniform (i.e.  $1/3$  for all values). Let  $\mathbf{y} = \mathbf{x}^2$ .

Compute first

$E[\mathbf{x}\mathbf{y}] =$

Then show that the two variables are uncorrelated yet dependent

While  $\mathbf{x}$  takes three values,  $\mathbf{y}$  may take only two values: 0 and 1.  
The variable  $\mathbf{z} = \mathbf{x}\mathbf{y}$  may then take three values: -1, 0, 1  
Let us see the probability of the three possible values

$P(\mathbf{z}=1) = P(\mathbf{x}=1, \mathbf{y}=1) = P(\mathbf{x}=1) = 1/3$   
 $P(\mathbf{z}=0) = P(\mathbf{x}=1, \mathbf{y}=0) + P(\mathbf{x}=0, \mathbf{y}=0) + P(\mathbf{x}=-1, \mathbf{y}=0) = 0 + 1/3 + 1/3$   
 $P(\mathbf{z}=-1) = P(\mathbf{x}=-1, \mathbf{y}=1) = 1/3$   
 $E[\mathbf{z}] = -1/3 + 0 + 1/3 = 0$

Question 2  
Terminé  
Note de 1,00 sur 1,00  
V Marquer la question

If two events are independent then they have the same probability.

- ☐ a. YES  
☒ b. NO

No. The property of independence concerns only the equality  $P(A, B) = P(A)P(B)$   
La réponse correcte est : NO

Question 3  
Terminé  
Note de 1,00 sur 1,00  
V Marquer la question

Let  $\mathbf{y}$  and  $\mathbf{x}$  have the same distribution. is the variance of  $\mathbf{x} - \mathbf{y}$  necessarily zero?

- ☐ a. YES  
☒ b. NO

No.  $\text{Var}(\mathbf{x} - \mathbf{y}) = \text{Var}(\mathbf{x}) + \text{Var}(\mathbf{y}) - 2\text{Cov}(\mathbf{x}, \mathbf{y})$ . So all depends on the nature of  $\mathbf{x}$  and  $\mathbf{y}$   
La réponse correcte est : NO

Question 4  
Terminé  
Note de 1,00 sur 1,00  
V Marquer la question

Let  $\mathbf{y}$  and  $\mathbf{x}$  be two binary random variables. If  $\mathbf{x}$  and  $\mathbf{y}$  are dependent, if  $P(\mathbf{y} = 1 | \mathbf{x} = 1) > 0.5$  is also necessarily  $P(\mathbf{y} = 1) > 0.5$ ?

- ☐ a. YES  
☒ b. NO

No. This is not required by the notion of dependency.  
La réponse correcte est : NO

Question 5  
Terminé  
Note de 1,00 sur 1,00  
V Marquer la question

Let  $\mathbf{y}$  and  $\mathbf{x}$  be two binary random variables. If  $\mathbf{x}$  and  $\mathbf{y}$  are dependent  $P(\mathbf{y} = 1 | \mathbf{x} = 1)$  is always different  $P(\mathbf{y} = 1 | \mathbf{x} = 0)$

- ☐ a. YES  
☒ b. NO

No. The dependency property does not impose such requirement.  
La réponse correcte est : NO

Question 6  
Terminé  
Note de 0,00 sur 1,00  
V Marquer la question

Are two conditionally independent random variables necessarily dependent?

- ☒ a. YES  
☐ b. NO

No. Conditional independence does not imply dependence.  
La réponse correcte est : NO

Question 7  
Terminé  
Note de 1,00 sur 1,00  
V Marquer la question

Let  $\mathbf{x}$  and  $\mathbf{y}$  two discrete independent r.v. such that

$P_{\mathbf{x}}(-1) = 0.1, P_{\mathbf{x}}(0) = 0.8, P_{\mathbf{x}}(1) = 0.1$   
and  
 $P_{\mathbf{y}}(1) = 0.1, P_{\mathbf{y}}(2) = 0.8, P_{\mathbf{y}}(3) = 0.1$

Compute

$E[\mathbf{x}] =$

$E[\mathbf{y}] =$

If  $\mathbf{z} = \mathbf{x} + \mathbf{y}$  compute numerically

$E[\mathbf{z}] =$   and verify

that  $E[\mathbf{z}] = E[\mathbf{x}] + E[\mathbf{y}]$

$E[\mathbf{x}] = -1*0.1 + 0*1 + 1*0.1 = 0$   
 $E[\mathbf{y}] = 0.1*1 + 0.8*2 + 0.1*3 = 2$

The domain of  $\mathbf{z}$  is:  $\{0, 1, 2, 3, 4\}$  and the probability function takes the values  
 $P = \{0, 0.1, 0.16, 0.66, 0.16, 0.01\}$   
 $E[\mathbf{z}] = 0.16*0 + 0.66*2 + 0.16*3 + 0.01*4 = 2$

Question 8  
Terminé  
Note de 1,00 sur 1,00  
V Marquer la question

Let  $\mathbf{y}$  and  $\mathbf{x}$  be two binary random variables. If  $\mathbf{x}$  and  $\mathbf{y}$  are dependent, is  $P(\mathbf{y} = 1 | \mathbf{x} = 1)$  always different from  $P(\mathbf{y} = 1)$ ?

- ☐ a. YES  
☒ b. NO

Not necessarily, it could be that  $P(\mathbf{y} = 1 | \mathbf{x} = 1) = P(\mathbf{y} = 1)$  but  
 $P(\mathbf{y} = 1 | \mathbf{x} = 0) \neq P(\mathbf{y} = 1)$   
La réponse correcte est : NO

Question 9  
Terminé  
Note de 0,00 sur 1,00  
V Marquer la question

Are two independent random variables always conditionally independent?

- ☐ a. YES  
☒ b. NO

No. Independence does not imply conditional independence.  
La réponse correcte est : NO

Question 10  
Terminé  
Note de 0,00 sur 1,00  
V Marquer la question

Consider four binary random variables  $\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3, \mathbf{y}$  such that the variables  $\mathbf{x}_i$  are conditionally independent given  $\mathbf{y}$ .

How many parameters are needed to specify its distribution? (Use the chain rule)

- ☐ a. 6  
☐ b. 5  
☐ c. 12  
☒ d. 3  
☐ e. 15  
☐ f. 7  
☐ g. 8  
☐ h. 10  
☐ i. 11  
☐ j. infinity

$P(\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3, \mathbf{y}) = P(\mathbf{x}_1 | \mathbf{x}_2, \mathbf{x}_3, \mathbf{y}) P(\mathbf{x}_2 | \mathbf{x}_3, \mathbf{y}) P(\mathbf{x}_3 | \mathbf{y}) P(\mathbf{y}) = P(\mathbf{x}_1 | \mathbf{y}) P(\mathbf{x}_2 | \mathbf{y}) P(\mathbf{x}_3 | \mathbf{y}) P(\mathbf{y})$   
 $7 = 2+2+2+1$

La réponse correcte est : 7

Question 11  
Terminé  
Note de 0,50 sur 1,00  
V Marquer la question

If the event  $\mathcal{E}_1 \subset \mathcal{E}_2$  and  $P(\mathcal{E}_1) > 0, P(\mathcal{E}_2) = 0.5$  then  $P(\mathcal{E}_1 | \mathcal{E}_2)$  is

- ☐ a. 1  
☐ b.  $< 1$   
☐ c. 0  
☒ d.  $\geq P(\mathcal{E}_1)$

$> P(\mathcal{E}_1)$  and  $< 1$  since the intersection of  $\mathcal{E}_1$  and  $\mathcal{E}_2$  is  $\mathcal{E}_1$   
Les réponses correctes sont :  $< 1$ ,  $\geq P(\mathcal{E}_1)$

Question 12  
Non répondu  
Note sur 1,00  
V Marquer la question

Consider four binary random variables  $\mathbf{x}, \mathbf{y}, \mathbf{z}, \mathbf{w}$  such that

- $\mathbf{y}$  is conditionally independent of  $\mathbf{z}$  given  $\mathbf{w}$
- $\mathbf{z}$  is independent of  $\mathbf{w}$

How many parameters are needed to specify its distribution? (Use the chain rule)

- ☐ a. 6  
☐ b. 5  
☐ c. 12  
☐ d. 3  
☐ e. 15  
☐ f. 7  
☐ g. 8  
☐ h. 10  
☐ i. 11  
☐ j. infinity

$P(\mathbf{x}, \mathbf{y}, \mathbf{z}, \mathbf{w}) = P(\mathbf{x} | \mathbf{y}, \mathbf{z}, \mathbf{w}) P(\mathbf{y} | \mathbf{z}, \mathbf{w}) P(\mathbf{z} | \mathbf{w}) P(\mathbf{w}) = P(\mathbf{x} | \mathbf{y}, \mathbf{z}, \mathbf{w}) P(\mathbf{y} | \mathbf{w}) P(\mathbf{z}) P(\mathbf{w})$   
 $12 = 8+2+1+1$   
La réponse correcte est : 12

Question 13  
Non répondu  
Note sur 2,00  
V Marquer la question

An important probability result is the Jensen's inequality  
 $f(E[\mathbf{x}]) \geq E[f(\mathbf{x})]$  if the function  $f$  is concave.

Suppose that  $\mathbf{x} \sim \mathcal{N}(\mu, \sigma^2 = 1)$  and  $f(x) = -x^2$

The student should compute by using  $R = 10000$  trials of a Monte Carlo simulation:

$f(E[\mathbf{x}]) =$

$E[f(\mathbf{x})] =$

and verify that the inequality is satisfied.

```
set.seed(0)
R=10000
# number of MC trials
f<-function(x){
  -x^2
}
```

```
PX=NULL
X=NULL
```

```
a=1
b=1
```

```
for (r in 1:R){
```

```
  x=norm(1,a,b)
```

```
  fx=f(x)
```

```
  Px=c(Px,fx)
```

```
  X=c(X,x)
```

```
}
```

```
muX=mean(X)
```

```
cat("E[f(x)]=",mean(f(X))
```

```
cat("\n f(E[X])=",f(muX))
```

Question 14  
Non répondu  
Note sur 2,00  
V Marquer la question

Let us consider two discrete r.v.s.

The variable  $\mathbf{x} \in \mathcal{X} = \{NEG, POS\}$  and  
 $\mathbf{y} \in \mathcal{Y} = \{GOOD, NEUTRAL, BAD\}$

Let

- $P(\mathbf{x} = NEG) = P(\mathbf{x} = POS)$
- $P(\mathbf{y} = GOOD | \mathbf{x} = NEG) = P(\mathbf{y} = NEUTRAL | \mathbf{x} = NEG) = 0.2$
- $P(\mathbf{y} = GOOD | \mathbf{x} = POS) = P(\mathbf{y} = BAD | \mathbf{x} = POS) = 0.2$

Compute the following entropy terms (using the natural logarithm)

$H[\mathbf{x}] =$

$H[\mathbf{y}] =$

$H[\mathbf{y} | \mathbf{x} = POS] =$

By using the law of total probability  
 $P(\mathbf{y}=GOOD) = P(\mathbf{y}=GOOD | \mathbf{x}=NEG)P(\mathbf{x}=NEG) + P(\mathbf{y}=GOOD | \mathbf{x}=POS)P(\mathbf{x}=POS) = 0.2*0.5 + 0.2*0.5 = 0.2$   
 $P(\mathbf{y}=NEUTRAL) = P(\mathbf{y}=NEUTRAL | \mathbf{x}=NEG)P(\mathbf{x}=NEG) + P(\mathbf{y}=NEUTRAL | \mathbf{x}=POS)P(\mathbf{x}=POS) = 0.2*0.5 + 0.2*0.5 = 0.4$   
 $P(\mathbf{y}=BAD) = P(\mathbf{y}=BAD | \mathbf{x}=NEG)P(\mathbf{x}=NEG) + P(\mathbf{y}=BAD | \mathbf{x}=POS)P(\mathbf{x}=POS) = 0.6*0.5 + 0.2*0.5 = 0.4$   
 $H(\mathbf{y}) = 1.05$

$P(\mathbf{y}=GOOD | \mathbf{x}=POS) = 0.2$   
 $P(\mathbf{y}=NEUTRAL | \mathbf{x}=POS) = 0.6$   
 $P(\mathbf{y}=BAD | \mathbf{x}=POS) = 0.2$   
 $H(\mathbf{y} | \mathbf{x}=POS) = 1.05$

Question 15  
Non répondu  
Note sur 2,00  
V Marquer la question

Let us consider three binary random variables  $\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3$  and their joint distribution  
How many parameters have to be set to define their joint distribution if

- we have no additional information
- the three variables are independent
- $\mathbf{x}_1$  is conditionally independent of  $\mathbf{x}_3$  given  $\mathbf{x}_2$   Hint: use the chain rule
- $\mathbf{x}_1$  is independent of the other two variables  Hint: use the chain rule

1, 8-1+7 parameters have to be defined since the sample space is made of 8 experimental outcomes and the probabilistic constraint applied  
3, 2+1+3 since  $P(\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3) = P(\mathbf{x}_1 | \mathbf{x}_2) P(\mathbf{x}_2 | \mathbf{x}_3)$  and for each of the three terms one parameter is enough  
3, 2+2+1+5 By using the chain rule and the conditional independence we obtain  $P(\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3) = P(\mathbf{x}_1 | \mathbf{x}_2, \mathbf{x}_3) P(\mathbf{x}_2 | \mathbf{x}_3) P(\mathbf{x}_3) = P(\mathbf{x}_1 | \mathbf{x}_2) P(\mathbf{x}_2 | \mathbf{x}_3) P(\mathbf{x}_3)$   
4, 1+2+1+4 By using the chain rule and the conditional independence we obtain  $P(\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3) = P(\mathbf{x}_1 | \mathbf{x}_2, \mathbf{x}_3) P(\mathbf{x}_2 | \mathbf{x}_3) P(\mathbf{x}_3) = P(\mathbf{x}_1 | \mathbf{x}_2) P(\mathbf{x}_2 | \mathbf{x}_3) P(\mathbf{x}_3)$

Question 16  
Terminé  
Note de 0,33 sur 2,00  
V Marquer la question

Consider the data frame Q1.Q2.D containing the joint probability distribution of the 4 categorical binary random variables  $\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3$  and  $\mathbf{y}$  each taking two possible values: yes and no.

The student should compute:

$P(\mathbf{y} = \text{no} | \mathbf{x}_1 = \text{yes}, \mathbf{x}_2 = \text{no}, \mathbf{x}_3 = \text{no}) =$

$P(\mathbf{x}_3 = \text{no} | \mathbf{x}_1 = \text{yes}, \mathbf{y} = \text{no}) =$

$P(\mathbf{x}_2 = \text{no} | \mathbf{x}_1 = \text{yes}, \mathbf{y} = \text{no}) =$

$P(\mathbf{x}_1 = \text{no} | \mathbf{x}_2 = \text{no}, \mathbf{x}_3 = \text{no}) =$

Are the two variables  $\mathbf{y}$  and  $\mathbf{x}_1$  independent?  
☐ Yes  
☒ No

La réponse correcte est : No

Explain why  Prob (E1 ∩ E2) = Prob (E1, E2) = Prob (E1) Prob (E2)

Are the two variables  $\mathbf{x}_3$  and  $\mathbf{x}_1$  conditionally independent given  $\mathbf{y} = \text{no}$ ?  
☐ Yes  
☒ No

La réponse correcte est : Yes

Explain why

Terminer la relecture

Aller à...

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