# Math 140 <br> Introductory Statistics 

Solutions are posted online

## Conditional probability

Conditional Probability refers to the probability of a particular event where additional information is known.


## An example

A laboratory technician is testing contaminated blood samples. Out of 100 samples, 20 are contaminated. Suppose she makes the correct decision $90 \%$ of the time (regardless of contamination or not). Make a table. What is the false positive rate? The false negative rate?

Detection of contamination

Contaminated?

|  | Pos | Neg | Total |
| :--- | :--- | :--- | :--- |
| Yes |  |  |  |
| No |  |  |  |
| Total |  |  | 100 |

## An example

|  | Pos | Neg | Total |
| :--- | :--- | :--- | :--- |
| Yes |  |  | 20 |
| No |  |  | 80 |
| Total |  |  | 100 |

$90 \%$ of the time she makes no mistakes

An example

|  | Pos | Neg | Total |
| :--- | :--- | :--- | :--- |
| Yes | 18 | 2 | 20 |
| No | 8 | 72 | 80 |
| Total |  |  | 100 |

An example

|  | Pos | Neg | Total |
| :--- | :--- | :--- | :--- |
| Yes | 18 | 2 | 20 |
| No | 8 | 72 | 80 |
| Total | 26 | 74 | 100 |


|  | Pos | Neg | Total |
| :--- | :--- | :--- | :--- |
| Yes | 18 | 2 | 20 |
| No | 8 | 72 | 80 |
| Total | 26 | 74 | 100 |

False Pos. Rate $=\mathrm{P}$ (no disease $\mid$ test positive)
False Neg. Rate= P(disease present | test negative)
Sensitivity $=P$ (test positive $\mid$ disease present) Specificity $=P$ (test negative $\mid$ no disease)

|  | Pos | Neg | Total |
| :--- | :--- | :--- | :--- |
| Yes | 18 | 2 | 20 |
| No | 8 | 72 | 80 |
| Total | 26 | 74 | 100 |

False Positive rate $=8 / 26=0.31$
False Negative rate $=2 / 74=0.027$
Sensitivity $=18 / 20=0.9$
Specificity $=72 / 80=0.9$

## Conditional probability and statistical interference

We start with models.
For example, what is the probability of drawing an even number while rolling a die?

$$
\mathrm{P}=3 / 6=0.5
$$

True if the model is that DIE IS FAIR

## Conditional probability and statistical interference

Let's now suppose that we suspect the die is not fair and that positive values are preferred. How do we know for sure?

If I launch the die 20 times, what is the probability of getting all fair numbers?

For a fair die that is
$0.5 * 0.5 * 0.5 \ldots$. etc $=0.5^{20} \sim 1$ in a million!
20 times

## Conditional probability and statistical interference

1 in a million is such a small number that we can assume that if we find positive values after 20 rolls the "fair die" model can be abandoned.

There is something wrong!

What we calculated is
P (get even on all 20 rolls $\mid$ the die is fair)

## Conditional probability and statistical interference

## But what we CANNOT calculate is

P (the die is fair \| we get even numbers on 20 rolls)

## The wise statistician says

If you start by assuming the model is true, you can compute the chances of various results.

But if you're trying to start from the results and compute the chance that the model is right or wrong:

## You can't do that!

## Independent events

| Weight Category |  | Male (\%) | Female (\%) | Row Total (\%) |
| :---: | :---: | :---: | :---: | :---: |
|  | Not Obese | 38 | 38 | 76 |
|  | Obese ( $B M I \geq 30$ ) | 12 | 12 | 24 |
|  | Column Total | 50 | 50 | 100 |

It makes no difference whether we are discussing males or females. The percentage of obese people is the same!

Calculate

P(obese | male)

## Independent events

| Weight Category |  | Male (\%) | Female (\%) | Row Total (\%) |
| :---: | :---: | :---: | :---: | :---: |
|  | Not Obese | 38 | 38 | 76 |
|  | Obese ( $B M I \geq 30$ ) | 12 | 12 | 24 |
|  | Column Total | 50 | 50 | 100 |

## Recall

$$
\mathrm{P}(\mathrm{~A} \text { and } \mathrm{B})=\mathrm{P}(\mathrm{~A})^{*} \mathrm{P}(\mathrm{~B} \mid \mathrm{A})
$$

$$
\begin{aligned}
& A=\text { male } \\
& B=\text { obese }
\end{aligned}
$$

## Independent events

| Weight Category |  | Male (\%) | Female (\%) | Row Total (\%) |
| :---: | :---: | :---: | :---: | :---: |
|  | Not Obese | 38 | 38 | 76 |
|  | Obese ( $B M I \geq 30$ ) | 12 | 12 | 24 |
|  | Column Total | 50 | 50 | 100 |

## Recall

$\mathrm{P}($ male and obese $)=\mathrm{P}(\text { male })^{*} \mathrm{P}$ (obese $\mid$ male $)$
$0.12=0.5 * \mathrm{P}($ obese $\mid$ male $)$
$\mathrm{P}($ obese $\mid$ male $)=0.12 / 0.5=0.24$
exact same thing for women and general population

## Independent events



They are all the same

$$
\begin{gathered}
\mathrm{P}(\text { obese } \mid \text { male })=0.12 / 0.5=0.24 \\
\mathrm{P}(\text { obese } \mid \text { female })=0.12 / 0.5=0.24 \\
\mathrm{P}(\text { obese })=24 / 100=0.24
\end{gathered}
$$

## Independent events

| Weight Category |  | Male (\%) | Female (\%) | Row Total (\%) |
| :---: | :---: | :---: | :---: | :---: |
|  | Not Obese | 38 | 38 | 76 |
|  | Obese ( $B M I \geq 30$ ) | 12 | 12 | 24 |
|  | Column Total | 50 | 50 | 100 |

The event OBESE is independent of the event MALE
A person at random is obese with probability $24 \%$

## Is obesity correlated with education?

| Weight Category |  | College or Technical School Graduate (\%) | Not a College or Technical School Graduate (\%) |
| :---: | :---: | :---: | :---: |
|  | Not Obese | 81 | 73 |
|  | Obese ( $B M I \geq 30$ ) | 19 | 27 |
|  | Column Total | 100 | 100 |

$\mathrm{P}($ obese $\mid$ college or technical school grad $)=19 \%$
$\mathrm{P}($ obese $\mid$ not a college or technical school grad $)=27 \%$

## Is obesity correlated with education?

| Weight Category |  | College or Technical School Graduate (\%) | Not a College or Technical School Graduate (\%) |
| :---: | :---: | :---: | :---: |
|  | Not Obese | 81 | 73 |
|  | Obese ( $B M I \geq 30$ ) | 19 | 27 |
|  | Column Total | 100 | 100 |

We knew that is we randomly selected a person by chance, we would get $24 \%$

These values are different, so the event OBESE is dependent on the event EDUCATION LEVEL

## Is obesity correlated with education?

This is important knowledge in publc policy.
For example is we had to design a campaign to reduce obesity, we would know NOT
to be concerned with gender differences but to focus more on non-college graduates

## Independent events

Events A and B are independent if and only if

$$
\mathrm{P}(\mathrm{~A} \mid \mathrm{B})=\mathrm{P}(\mathrm{~A}) \quad \mathrm{P}(\text { obese } \mid \text { male })=\mathrm{P}(\text { obese })
$$

Equivalently, A and Bare independent if and only if

$$
\mathrm{P}(\mathrm{~B} \mid \mathrm{A})=\mathrm{P}(\mathrm{~B})
$$

Knowing that B happened does not affect the probability of A happening. Knowing that A happened does not affect the probability of $B$ happening.

$$
\begin{gathered}
\text { We knew that } \\
P(A \text { and } B)=P(A)^{*} P(B \mid A)
\end{gathered}
$$

For independent events $\mathrm{P}(\mathrm{B} \mid \mathrm{A})=\mathrm{P}(\mathrm{B})$ this becomes

$$
\mathrm{P}(\mathrm{~A} \text { and } \mathrm{B})=\mathrm{P}(\mathrm{~A})^{*} \mathrm{P}(\mathrm{~B})
$$

## Multiplication Rule for Independent Events

Two events $A$ and $B$ where $P(A)>0$ and $P(B)>0$ are independent if and only if

$$
P(A \text { and } B)=P(A) \cdot P(B)
$$

More generally, events $A_{1}, A_{2}, \ldots, A_{n}$ are independent if and only if

$$
P\left(A_{1} \text { and } A_{2} \text { and } \ldots \text { and } A_{n}\right)=P\left(A_{1}\right) \cdot P\left(A_{2}\right) \cdot \cdots \cdot P\left(A_{n}\right)
$$

# So the test for independence is 

$$
\begin{gathered}
\text { Check if } P(B \mid A)=P(B) \\
\quad \text { or } P(A \mid B)=P(A)
\end{gathered}
$$

from here we can say

$$
\mathrm{P}(\mathrm{~A} \text { and } \mathrm{B})=\mathrm{P}(\mathrm{~A})^{*} \mathrm{P}(\mathrm{~B})
$$

## For coin flipping

If we flip a coin four times what is the probability that all flips give heads?

These are independent events so that
$P($ heads 1 and heads 2 and heads 3 and heads 4$)=$ $\mathrm{P}($ heads 1$)$ * $\mathrm{P}($ heads 2 ) * $\mathrm{P}($ heads 3$)$ * $\mathrm{P}($ heads 4$)=$

$$
1 / 2^{*} 1 / 2^{*} 1 / 2^{*} 1 / 2=
$$

$1 / 16$

## You try to check for independence

 Are the events being male and identifying tap water independent?The test is: $\mathrm{P}(\mathrm{A} \mid \mathrm{B})=\mathrm{P}(\mathrm{A})$ ?
If yes, they are independent


## You try to check for independence

 $\mathrm{P}($ male $\mid$ identify $)=\mathrm{P}($ male $)$ ?| Identified Tap |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- |
| Water? |  |  |  |  |
|  Yes No <br> Gender Total  <br>  Male 21 <br> 14 35  <br>  Female 39 <br> 26 65  <br>  Total 60 <br> 40 100  |  |  |  |  |

$\mathrm{P}($ male $\mid$ identify $)=21 / 60$

$$
\mathrm{P}(\text { male })=35 / 100
$$

## You try to check for independence

$$
\mathrm{P}(\text { male } \mid \text { identify })=\mathrm{P}(\text { male })=7 / 20 \text { YES }
$$

|  |  |  |  | Identified Tap |
| :--- | :--- | :--- | :--- | :--- |
| Water? |  |  |  |  |
|  |  | Yes | No | Total |
| Gender | Male | 21 | 14 | 35 |
|  | Female | 39 | 26 | 65 |
|  | Total | 60 | 40 | 100 |

THE EVENTS ARE INDEPENDENT

## Another case



Are the events identifying tap water and drinking bottled water independent?

## Another case

|  |  |  |  | Identified Tap |
| :--- | :--- | :--- | :--- | :--- |
| Water? |  |  |  |  |
|  |  | Yes | No | Total |
| Drinks |  |  |  |  |
| Bottled |  |  |  |  |
| Water? | Yes | 24 | 6 | 30 |
|  | No | 36 | 34 | 70 |
|  | Total | 60 | 40 | 100 |

$\mathrm{P}($ drinking bottled water $\mid$ identifying tap water $)=$ 24/60
$\mathrm{P}($ drinking bottled water $)=30 / 100$

## They are different

$\mathrm{P}($ drinking bottled water $\mid$ identifying tap water $)=4 / 10$
$\mathrm{P}($ drinking bottled water $)=3 / 10$
The two events are DEPENDENT

|  |  |  |  | Identified Tap |
| :--- | :--- | :--- | :--- | :--- |
| Water? |  |  |  |  |
|  |  | Yes | No | Total |
| Drinks |  |  |  |  |
| Bottled |  |  |  |  |
| Water? | Yes | 24 | 6 | 30 |
|  | No | 36 | 34 | 70 |
|  | Total | 60 | 40 | 100 |

Does knowing that event A happened increase, decrease or leave unchanged the probability of event $B$ ?

A: The student is a football player. B: The student weighs less than 120 pounds.

A: The student has long fingernails. B: The student is female.

A: The student is a freshman. $B$ : The student is male.

A: The student is a freshman.
$B$ : The student is a senior.

## The Dodger games

Won the
Game?

|  | Yes | No | Total |  |
| :--- | :--- | :--- | :--- | :--- |
|  | Day | 11 | 10 | 21 |
| Time of <br> Game | Night | 30 | 27 | 57 |
|  | Total | 41 | 37 | 78 |
|  |  |  |  |  |

The Los Angeles Dodgers won a 41 games and lost 37.
Are the events win and day game independent?
Calculate P (win) vs. P (win | day)

## A grain of salt

Won the
Game ?

|  | Yes | No | Total |  |
| :--- | :--- | :--- | :--- | :--- |
|  | Day | 11 | 10 | 21 |
| Time of | Name | Night | 30 | 27 |
|  | Total | 41 | 37 | 78 |

$$
\begin{gathered}
\mathrm{P}(\operatorname{win})=41 / 78=0.526 \\
\mathrm{P}(\text { win } \mid \text { day })=11 / 21=0.524
\end{gathered}
$$

They seem dependent, since the numbers are different, but they are so close! In practice, because the datais small, we can conclude they are independent.

We will work with other tests, later

## Health care in America

## About 30\% of Americans between 18 and 24 don't have health insurance.

What is the chance that if I select 2 people at random, One will have health insurance and the other will not?

## Health care in America

## About 30\% of Americans between 18 and 24 don't have health insurance.

What is the chance that if I select 2 people at random, One will have health insurance and the other wll not?

These are independent events, so that $\mathrm{P}(1$ st yes health insurance and 2nd no heath insurance)

$$
\begin{gathered}
=\mathrm{P}(\text { yes h.i) })^{*} \mathrm{P}(\text { no h.i | yes h. I. }) \\
\mathrm{P}(\text { yes h.i) } \\
=\mathrm{P}(\text { no h.i) } \\
=0.3 * 0.7=0.21
\end{gathered}
$$

## Health care in America

About $30 \%$ of young American adults ages 19 to 29 don't have health insurance.

Suppose you take a random sample of ten American adults in this age group. What is the probability that at
least one of them
doesn't have health insurance?

## Let's think

$\mathrm{P}($ at least one DOES NOT have health insurance $)=$

$$
1 \text { - } \mathrm{P} \text { (all have it) }
$$

## Let's think

$\mathrm{P}($ at least one DOES NOT have health insurance $)=$

$$
1-\mathrm{P}(\text { all have it })=
$$

$1-\mathrm{P}$ (1st has it AND 2nd has it AND .. 10th has it)

## Let's think

$\mathrm{P}($ at least one DOES NOT have health insurance $)=$

$$
1-\mathrm{P}(\text { all have it })=
$$

$1-\mathrm{P}(1$ st has it AND 2nd has it AND .. 10th has it $)=$ $1-\mathrm{P}(1$ st has it) * $\mathrm{P}(2$ nd has it$) \ldots$ * $\mathrm{P}(10$ th has it $)$

## Since they are independent

## Let's think

$\mathrm{P}($ at least one DOES NOT have health insurance $)=$

$$
1-\mathrm{P}(\text { all have it })=
$$

$1-\mathrm{P}(1$ st has it AND 2nd has it AND .. 10th has it $)=$
$1-\mathrm{P}(1$ st has it) * $\mathrm{P}(2$ nd has it$) \ldots$ * $\mathrm{P}(10 \mathrm{th}$ has it$)=$

$$
1-0.7 \text { * } 0.7 \text { * } 0.7 \ldots{ }^{*} 0.7
$$

ten times $=$

$$
\begin{gathered}
1-(0.7)^{10} \\
=0.972
\end{gathered}
$$

## A sad story - Sally Clark

2 of her kids died of sudden infant death syndrome Assume these are independent events and calculate

## P (baby 1 died and baby 2 dies)

Assuming $\mathrm{P}($ baby dies $)=1 / 8500$

## A sad story - Sally Clark

If the events were independent

# $\mathrm{P}($ baby 1 died and baby 2 dies $)=$ $\mathrm{P}($ baby 1 died) * $\mathrm{P}($ baby 2 died | baby 1 died $)$ <br> $=\mathrm{P}($ baby 1 died $) * \mathrm{P}($ baby 2 died $)=$ 1/8500 * 1/8500 

1 in 70 million
In the UK there are only about 200,000 second births per year

She was sentenced to life in prison

## A sad story - Sally Clark

The Royal Statistical Society of the UK argued that two babies dying in the same family ARE NOT independent
and concluded that the previous analysis does not apply.

$$
\begin{gathered}
P(\text { baby } 1 \text { died and baby } 2 \text { dies })= \\
P(\text { baby } 1 \text { died }) * P(\text { baby } 2 \text { died } \mid \text { baby } 1 \text { died }) \\
=1 / 8500 * 1 / 100
\end{gathered}
$$

This translates to one or two per year for the UK data

## A sad story - Sally Clark

## Sally Clark was released from prison

She died after 4 years.
Her family says she never recovered from the miscarriage of justice.

## Hk

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