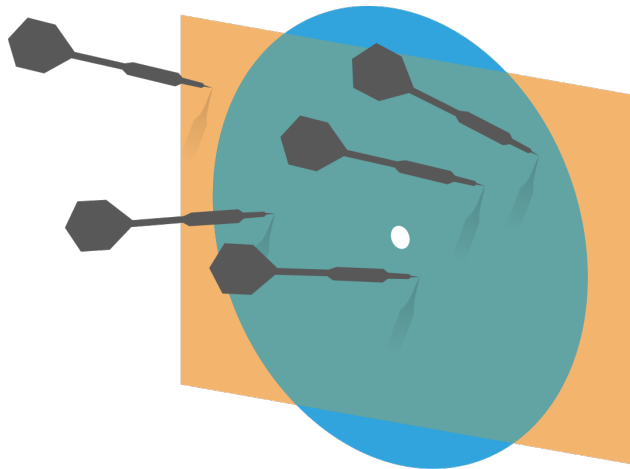


# Probability and Statistics for Computer Science



Credit: wikipedia

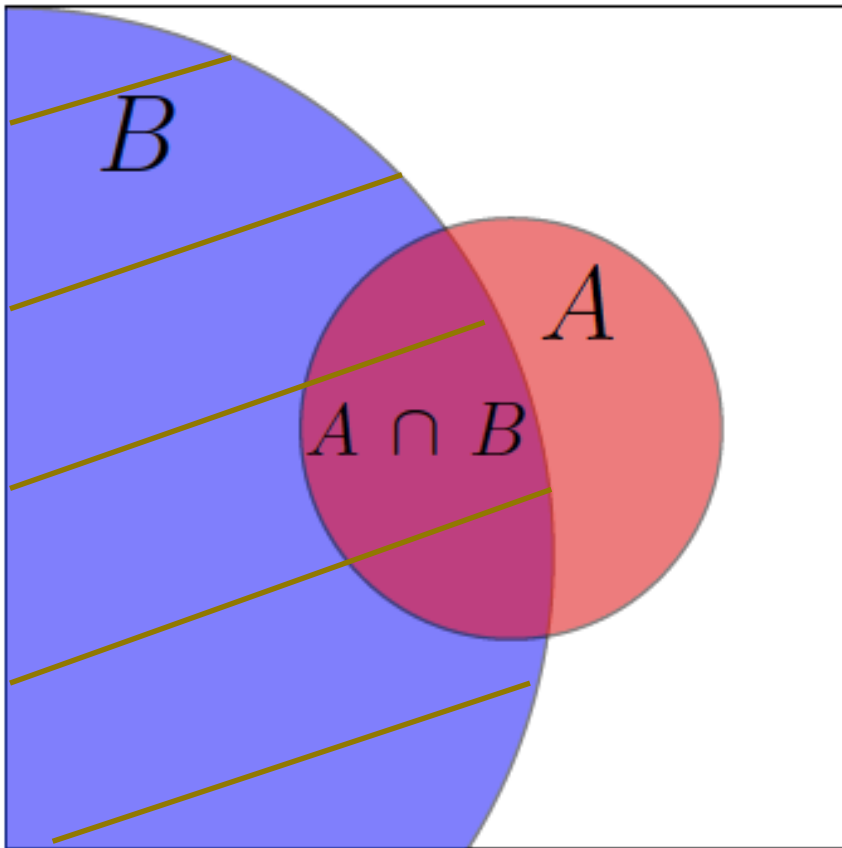
“A major use of probability in statistical inference is the updating of probabilities when certain events are observed” – Prof. M.H. DeGroot

# Objectives

- ✱ Conditional Probability
  - ✱ Review
  - ✱ Total probability
  - ✱ Independence

# Conditional Probability

✿ The probability of **A** given **B**



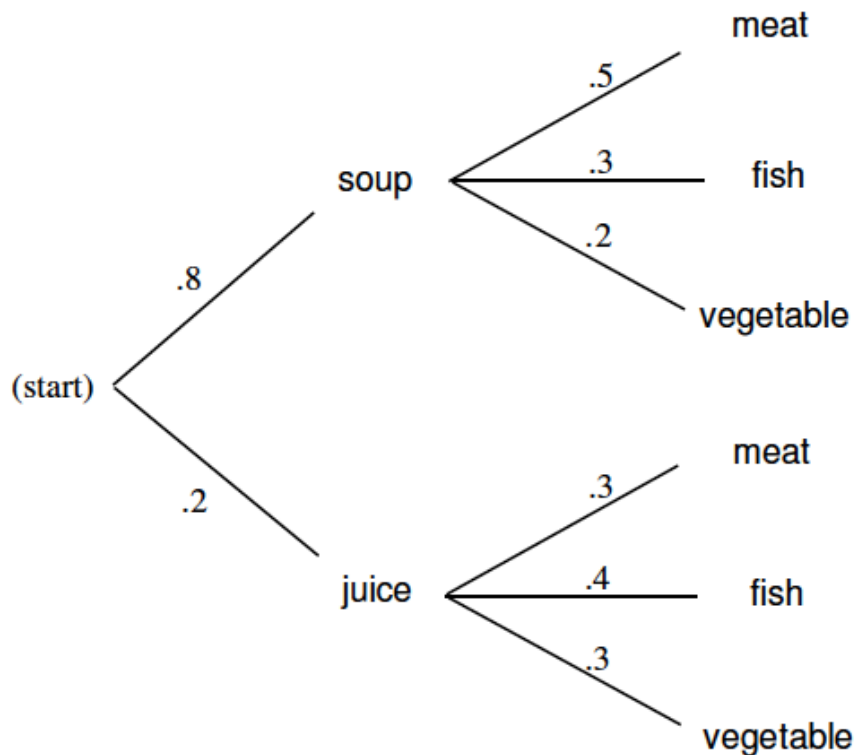
$$P(A|B) = \frac{P(A \cap B)}{P(B)}$$

$$P(B) \neq 0$$

The line-crossed area is the new sample space for conditional  $P(A|B)$

# Joint Probability Calculation

$$\Rightarrow P(A \cap B) = P(A|B)P(B)$$



$$\begin{aligned} P(\textit{soup} \cap \textit{meat}) &= \\ P(\textit{meat}|\textit{soup})P(\textit{soup}) &= \\ = 0.5 \times 0.8 &= 0.4 \end{aligned}$$

# Bayes rule

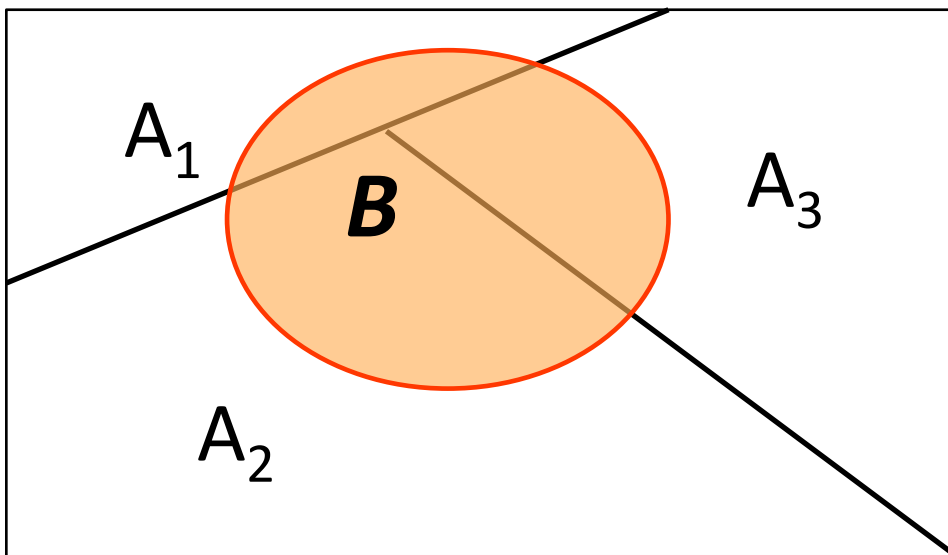
- ✱ Given the definition of conditional probability and the symmetry of joint probability, we have:

$$P(A|B)P(B) = P(A \cap B) = P(B \cap A) = P(B|A)P(A)$$

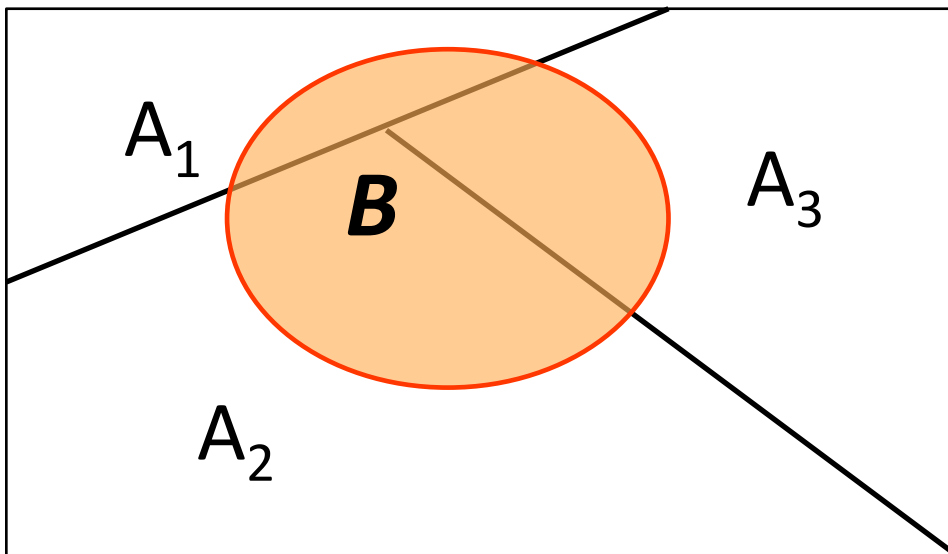
And it leads to the famous Bayes rule:

$$P(A|B) = \frac{P(B|A)P(A)}{P(B)}$$

# Total probability



# Total probability general form



Total probability:





Bayes rule using total prob.



# Bayes rule: rare disease test

There is a blood test for a rare disease. The frequency of the disease is  $1/100,000$ . If one has it, the test confirms it with probability 0.95. If one doesn't have, the test gives false positive with probability 0.001. What is  $P(D|T)$ , the probability of having disease given a positive test result?

$$P(D|T) = \frac{P(T|D)P(D)}{P(T)} \leftarrow \text{Using total prob.}$$
$$= \frac{P(T|D)P(D)}{P(T|D)P(D) + P(T|D^c)P(D^c)}$$

# Bayes rule: rare disease test

There is a blood test for a rare disease. The frequency of the disease is **1/100,000**. If one has it, the test confirms it with probability 0.95. If one doesn't have, the test gives false positive with probability **0.001**. What is  $P(D|T)$ , the probability of having disease given a positive test result?

$$P(D|T) = \frac{P(T|D)P(D)}{P(T|D)P(D) + P(T|D^c)P(D^c)}$$

# Independence

✱ One definition:

$$P(A|B) = P(A) \text{ or}$$

$$P(B|A) = P(B)$$

Whether A happened doesn't change the probability of B and vice versa



# Independence

## ✱ Alternative definition

LHS by definition  $P(A|B) = P(A)$

$$\Rightarrow \frac{P(A \cap B)}{P(B)} = P(A)$$

$$\Rightarrow P(A \cap B) = P(A)P(B)$$

# Testing Independence:

- ✱ Suppose you draw one card from a standard deck of cards.  $E_1$  is the event that the card is a King, Queen or Jack.  $E_2$  is the event the card is a Heart. Are  $E_1$  and  $E_2$  independent?

# Pairwise independence is not mutual independence in larger context

$A_1$	$A_2$
$A_4$	$A_3$

$$P(A_1) = P(A_2) = P(A_3) = P(A_4) = 1/4$$

$$A = A_1 \cup A_2; P(A)$$

$$B = A_1 \cup A_3; P(B)$$

$$C = A_1 \cup A_4; P(C)$$

*\* $P(ABC)$  is the shorthand for  $P(A \cap B \cap C)$*



# Mutual independence

- ✱ Mutual independence of a collection of events  $A_1, A_2, A_3 \dots A_n$  is :

$$P(A_i | A_j A_k \dots A_p) = P(A_i)$$

$$j, k, \dots p \neq i$$

- ✱ It's very strong independence!

# Probability using the property of Independence: Airline overbooking (1)

- ✱ An airline has a flight with 6 seats. They always sell 7 tickets for this flight. If ticket holders show up independently with probability  $p$ , what is the probability that the flight is overbooked ?

# Probability using the property of Independence: Airline overbooking (1)

- ✱ An airline has a flight with 6 seats. They always sell 7 tickets for this flight. If ticket holders show up independently with probability  $p$ , what is the probability that the flight is overbooked ?

$P(7 \text{ passengers showed up})$

## Probability using the property of Independence: Airline overbooking (2)

- ✱ An airline has a flight with 6 seats. They always sell 8 tickets for this flight. If ticket holders show up independently with probability  $p$ , what is the probability that exactly 6 people showed up?

$P(6 \text{ people showed up}) =$

## Probability using the property of Independence: Airline overbooking (3)

- ✱ An airline has a flight with 6 seats. They always sell 8 tickets for this flight. If ticket holders show up independently with probability  $p$ , what is the probability that the flight is overbooked ?

$P(\text{overbooked}) =$

# Probability using the property of Independence: Airline overbooking (4)

- ✱ An airline has a flight with  $s$  seats. They always sell  $t$  ( $t > s$ ) tickets for this flight. If ticket holders show up independently with probability  $p$ , what is the probability that exactly  $u$  people showed up?

$P(\text{ exactly } u \text{ people showed up})$

# Probability using the property of Independence: Airline overbooking (5)

- ✱ An airline has a flight with  $s$  seats. They always sell  $t$  ( $t > s$ ) tickets for this flight. If ticket holders show up independently with probability  $p$ , what is the probability that the flight is overbooked ?

$P(\text{overbooked})$

# Independence vs Disjoint

✱ Q. Two disjoint events that have probability  $> 0$  are certainly dependent to each other.

A. True

B. False



# Independence of empty event

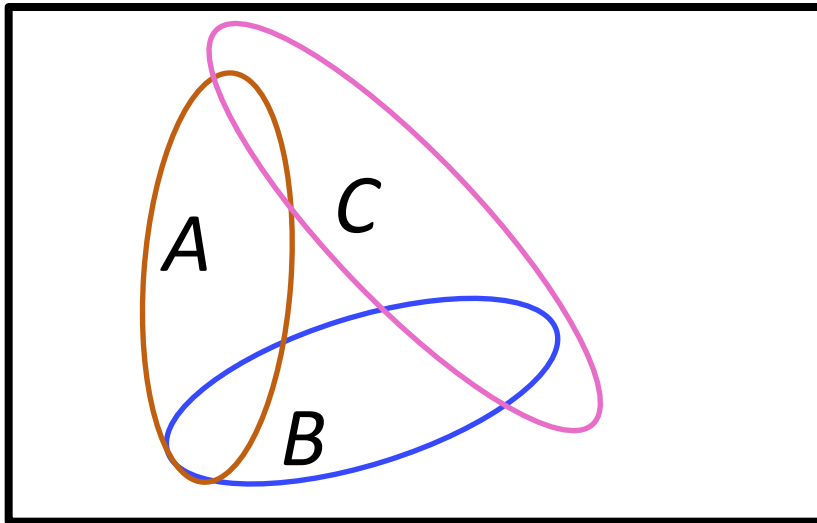
✱ Q. Any event is independent of empty event B.

A. True

B. False

# Condition may affect Independence

- ✱ Assume event  $A$  and  $B$  are pairwise independent



Given  $C$ ,  $A$  and  $B$  are not independent any more because they become disjoint

# Conditional Independence

✱ Event **A** and **B** are conditional independent given event **C** if the following is true.

$$P(A \cap B|C) = P(A|C)P(B|C)$$

See an example in Degroot et al. Example 2.2.10

# Assignments

- ✱ Module week3 on Compass
- ✱ Next time: Random variable

# Additional References

- ✱ Charles M. Grinstead and J. Laurie Snell  
"Introduction to Probability"
- ✱ Morris H. Degroot and Mark J. Schervish  
"Probability and Statistics"

See you next time

*See  
You!*

