

# Probability rules

FW8051 Statistics for Ecologists

Department of Fisheries, Wildlife and Conservation Biology



# Learning objectives

Understand and be able to work with basic rules of probability.

We will need these rules to understand **Bayes Theorem**, which is fundamental to Bayesian statistics.

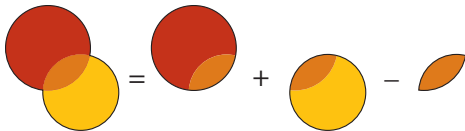
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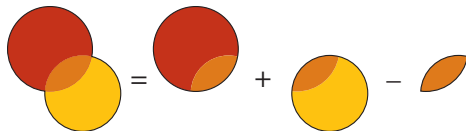


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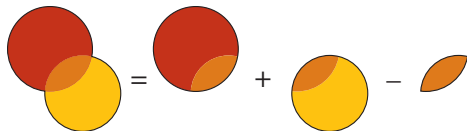
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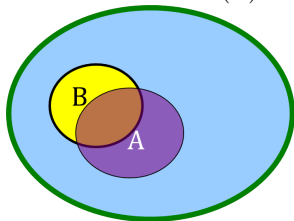
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3.  $P(\text{not } A) = 1 - P(A)$

4.  $P(A | B) = \frac{P(A \text{ and } B)}{P(B)}$  (probability of "A given B")



## [Think-Pair-Share]

Based on recent survey data, 50% of students drink caffeine in the morning, 45% of students drink caffeine in the afternoon, and 37% drink caffeine in the morning and the afternoon. What percent of students who drink caffeine in the morning also drink caffeine in the afternoon?

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$$= P(A \text{ and } M) / P(M) = 0.37 / 0.50 = 0.74$$

## Caffeine [Think-Pair-Share]

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$P(\text{not}(M \text{ or } A))$

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$$= 1 - 0.58 = 0.42$$



## [Think-Pair-Share]

A wildlife biologist surveys 100 different plots, looking for pheasants. Suppose:

- 30% of the plots contain pheasants.
- The biologist has a 60% chance of detecting pheasants when they are present.

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$$P(\text{present and seen}) = P(\text{Seen} \mid \text{present})P(\text{present})$$

$$= 0.3 \times 0.6 = 0.18$$

# Mutually Exclusive Events

Two events are **mutually exclusive** if they cannot both be true:  
 $P(A \text{ and } B) = 0$ .

Sample Space

- Role of a die: {1,2,3,4,5,6}
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$P(A \text{ or } B) = P(A) + P(B)$  for mutually exclusive events.

# Independence

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If A and B are independent then:

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

*We have been using this rule to construct Likelihoods!*

# Summary of Special Cases

If events A and B are mutually exclusive:

- $P(A \text{ or } B) = P(A) + P(B)$
- $P(A \text{ and } B) = 0$

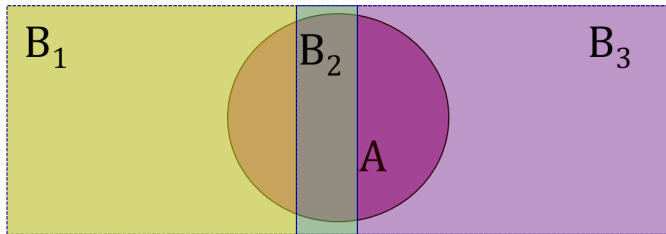
If events A and B are independent:

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

# Law of Total Probability

If events  $B_1, B_2, \dots, B_k$  are mutually exclusive and together make up all possibilities, then:

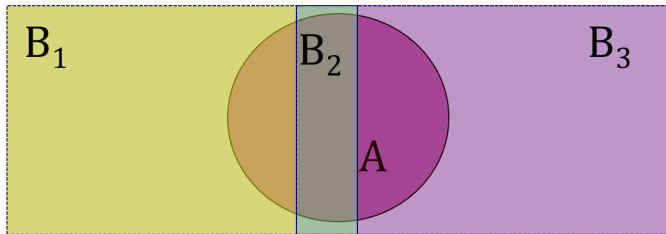
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# Law of Total Probability

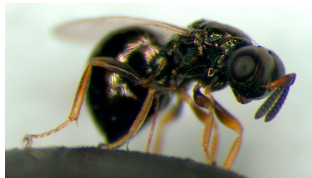
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Special Case:  $P(A) = P(A \text{ and } B) + P(A \text{ and (not } B))$

## Jewel wasp: from Whitlock and Schluter Example 5.8



Females can manipulate sex of the eggs they lay

- Previously parasitized hosts <- lay more male eggs
- Host that have not been previously parasitized <- lay more female eggs



## Jewel Wasp [Exercise]

Suppose:

- When a wasp finds a host, there is a 0.20 probability another wasp has already laid eggs in it
- If the host is unparasitized, the female lays a male egg with prob = 0.05 (and female egg with prob = 0.95)
- If the host already has eggs, the female lays a male egg with prob = 0.90 (and female egg with prob = 0.10)

Use the total law of probability to determine the probability (sex of new egg is male). Hint: let  $A = \{\text{male}\}$ ,  $B = \{\text{previously parasitized, not previously parasitized}\}$

# Jewel Wasp

Probability(sex of new egg is male)

=  $P(\text{male \& previously parasitized}) + P(\text{male \& not previously parasitized})$

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Probability(sex of new egg is male)

=  $P(\text{male} \ \& \ \text{previously parasitized}) + P(\text{male} \ \& \ \text{not previously parasitized})$

=  $P(\text{male} \mid \text{previously parasitized})P(\text{previously parasitized}) + P(\text{male} \mid \text{not previously parasitized})P(\text{not previously parasitized})$

# Jewel Wasp

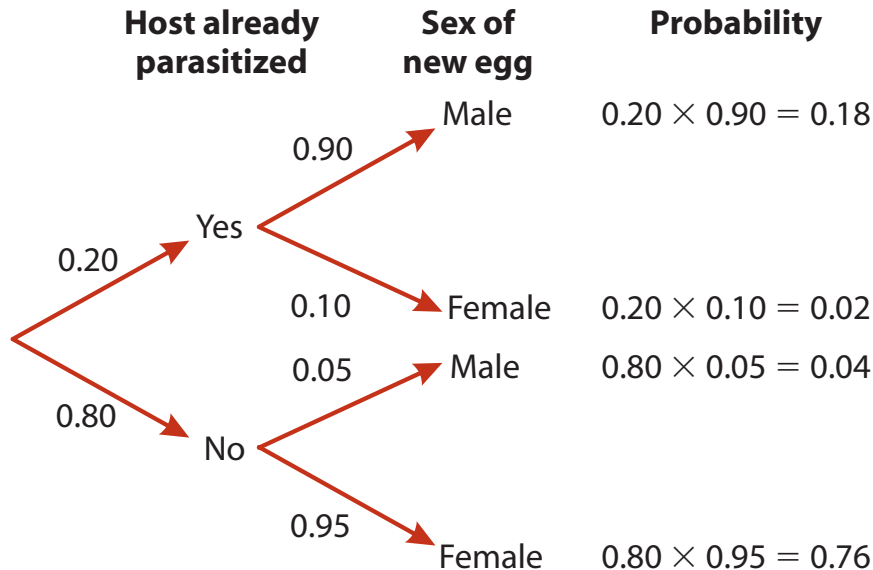
Probability(sex of new egg is male)

= P(male & previously parasitized) + P(male & not previously parasitized)

= P(male | previously parasitized)P(previously parasitized) +  
P(male | not previously parasitized)\*P(not previously parasitized)

=  $0.2 \times 0.9 + 0.05 \times 0.8 = 0.22$

# Tree Diagram



# Bayes Theorem

Let  $\bar{A} = \text{not}(A)$

$$\begin{aligned}P(A \mid B) &= \frac{P(A \text{ and } B)}{P(B)} \\&= \frac{P(B|A)P(A)}{P(B \text{ and } A) + P(B \text{ and } \bar{A})} \\&= \frac{P(B|A)P(A)}{P(B|A)P(A) + P(B|\bar{A})P(\bar{A})}\end{aligned}$$

The last two expressions can be extended to more than 2 groups using the total law of probability

## Example: Trisomy 21 or Down Syndrome

Caused by an extra copy of chromosome 21.

- 1 in 800 children have Down Syndrome, i.e.,  
 $P(D) = 1/800 = 0.00125$
- A multiple-marker screening test can be performed in the second trimester of pregnancy
- False Positive:  $P(+|\bar{D}) = 0.05$
- False Negative:  $P(-|D) = 0.19$

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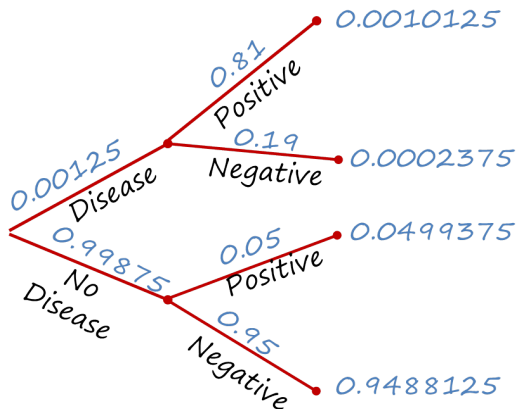
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Use Bayes rule:  $P(A|B) = \frac{P(B|A)P(A)}{P(B|A)P(A)+P(B|\bar{A})P(\bar{A})}$ . It might also help to draw a probability tree.



# Probability Tree



$$P(D \mid +) = P(D \text{ and } +) / P(+)$$

$$= 0.0010125 / [0.0010125 + 0.0499375] = 0.02$$

# Lets Make A Deal



1. 3 doors (2 goats and 1 car)
2. Monte knows where the car is, but you don't
3. You pick a door and Monte opens one of the remaining doors holding a goat.
4. Should you switch doors?

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# Answer

4 options, determined by 2 decisions

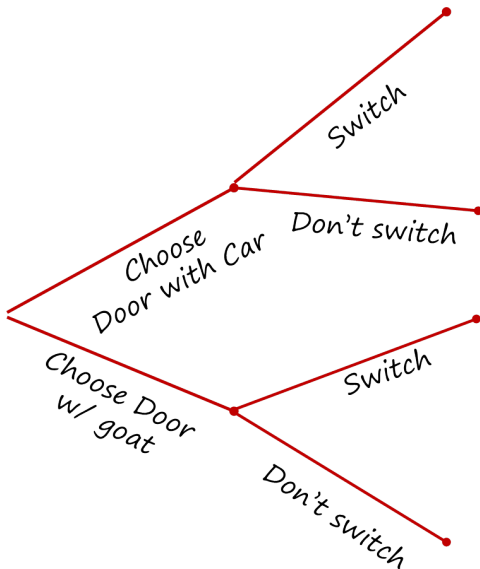
Step 1:

- You choose the door with the car behind it.
- You choose the door without the car behind it.

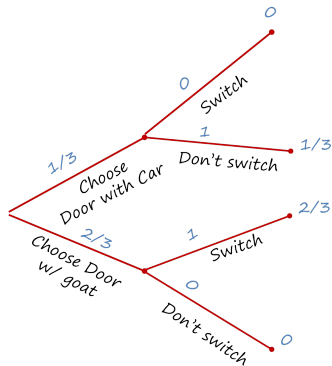
Step 2:

- You switch your choice
- You do not switch your choice.

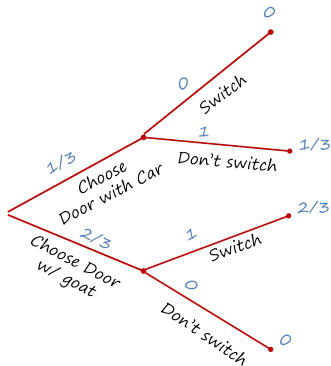
# Sample Space



# Probability Tree

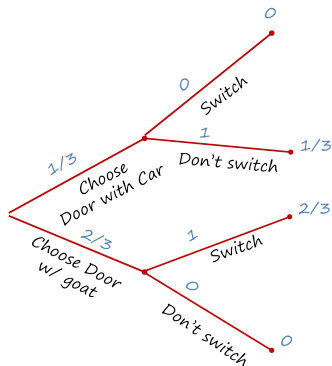


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$$P(\text{Win} \mid \text{Switch}) = 0 + 2/3$$

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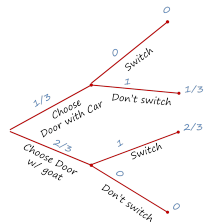


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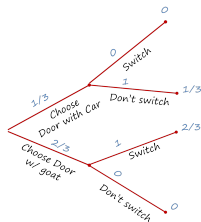
$$P(\text{Win} \mid \text{do not Switch}) = 1/3 + 0 = 1/3$$



# Probability Tree



# Probability Tree



$$P(\text{win} \mid \text{switch}) = P(\text{win \& switch} \mid \text{car first})P(\text{car first}) + P(\text{win \& switch} \mid \text{goat first})P(\text{goat first}) = 0 + 2/3$$

$$P(\text{win} \mid \text{stay put}) = P(\text{win \& stay put} \mid \text{car first})P(\text{car first}) + P(\text{win \& stay put} \mid \text{goat first})P(\text{goat first}) = 1/3 + 0$$

For some interesting comments on the problem, see: [Link](#)