











How do we find the probability that both events happen, P(A and B)? Start with the conditional probability formula

This formula is known as the **general multiplication rule**.  $P(A \text{ and } B) = P(A) \ge P(B)$ 





Tennis great Roger Federer made 63% of his first serves in the 2011 season. When Federer made his first serve, he won 78% of the points. When Federer missed his first serve and had to serve again, he won only 57% of the points. Suppose we randomly choose a point on which Federer served.

The figure on the next slide shows a tree diagram for this chance process. There are only two possible outcomes on Federer's first serve, a make or a miss. The first set of branches in the tree diagram displays these outcomes with their probabilities. The second set of branches shows the two possible results of the point for Federer—win or lose—and the chance of each result based on the outcome of the first serve. Note that the probabilities on the second set of branches are conditional probabilities, like  $P(\text{win point} \mid \text{make first serve}) = 0.78$ .



The previous calculation amounts to multiplying probabilities along the branches of the tree diagram. Why does this work? The general multiplication rule provides the answer:

make first serve and win point) = P(make first serve) · P(win point | make first serve = (0.63)(0.78) = 0.4914



**Example 5:** Video-sharing sites, led by YouTube, are popular destinations on the Internet. Let's look only at adult Internet users, aged 18 and over. About 27% of adult Internet users are 18 to 29 years old, another 45% are 30 to 49 years old, and the remaining 28% are 50 and over. The Pew Internet and American Life Project finds that 70% of Internet users aged 18 to 29 have visited a video-sharing site, along with 51% of those aged 30 to 49 and 26% of those 50 or older. Do most Internet users visit YouTube and similar sites?

Suppose we select an adult Internet user at random.









your work. P(breast cancer | positive mammogram) =  $\frac{P(breast cancer and positive mammogram)}{P(northing the mammogram)}$ 











One of the questions asked whether each student was right or left-handed. The two-way table summarizes the class data. Choose a student from the class at random. The events of interest are "female" and "right-handed."

Handedness	Gender	
	Female	Male
Left	3	1
Right	18	6

Independent. P(right-handed) = 24/28 = 6/7 is the same a  $P(\text{right-handed} \mid \text{female}) = 18/21 = 6/7$ .



**Example 8:** For each chance process below, determine whether the events are independent. Justify your answer.

a) Shuffle a standard deck of cards, and turn over the top card. Put it back in the deck, shuffle again, and turn over the top card. Define events A: first card is a

b) Shuffle a standard deck of cards, and turn over the top two cards, one at a time. Define events *A*: first card is a heart, and *B*: second card is a heart.

heart, and B: second card is a heart.



Example 9: In January 28, 1986, Space Shuttle *Challenger* exploded on takcoff. All seven crew members were killed. Following the disaster, scientists and statisticians helped analyze what went wrong. They determined that the failure of O-ring joints in the shuttle's booster rockets was to blame. Under the cold conditions that day, experts estimated that the probability that an individual O-ring joint would function properly was 0.977. But there were six of these O-ring joints, and all six had to function properly for the shuttle to launch safely. Assuming that O-ring joints succeed or fail independently, find the probability that the shuttle would launch safely under similar conditions.

P(joint1 OK and joint 2 OK and joint 3 OK and joint 4 OK and joint 5 OK and joint 6 OK)

= $P(\text{joint 1 OK}) \bullet P(\text{joint 2 OK}) \bullet \dots \bullet P(\text{joint 6 OK})$ 

=(0.977)(0.977)(0.977)(0.977)(0.977)(0.977)

= 0.87

Example 10: Many people who come to clinics to be tested for HIV, the virus that causes AIDS, don't come back to learn the test results. Clinics now use "rapid HIV test" that give a result while the client waits. In a clinic in Malawi, for example, use of rapid tests increased the percent of clients who learned their test results from 69% to 99.7%.

The trade-off for fast results is that rapid tests are less accurate than slower laboratory tests. Applied to people who have no HIV antibodies, one rapid test has probability about 0.004 of producing a false positive (that is, of falsely indicating that antibodies are present). If a clinic tests 200 randomly selected people who are free of HIV antibodies, what is the chance that at least one false positive will occur?

It is reasonable to assume that the test results for different individuals are independent. We have 200 independent events, each with probability 0.004. "at least one" combines many possible outcomes. It will be easier to use the fact that

P(at least one positive) = 1 - P(no positives)



Example 11: Lately, it seems that we've been hearing more in the news about athletes who have tested positive for performance-enhancing drugs. From Major League Baseball, to the Tour de France, to the Olympics, we have learned about athletes who took banned substances. Sports at all levels now have programs in place to test athletes' urine or blood samples. There's an important question about drug testing that probability can help answer: if an athlete tests positive for a banned substance, did the athlete necessarily attempt to cheat?

Over 10,000 athletes competed in the 2008 Olympic Games in Beijing. The International Olympic Committee wanted to ensure that the competition was as fair as possible. So the committee administered more than 5000 drug tests to athletes. All medal winners were tested, as well as other randomly selected competitors.

Suppose that 2% of athletes had actually taken (banned) drugs. No drug test is perfect. Sometimes the test says that an athlete took drugs, but the athlete actually didn't. We call this a false positive result. Other times, the drug test says an athlete is "clean," but the athlete actually took drugs. This is called a false negative result. Suppose that the testing procedure used at the Olympics has a false positive rate of 1% and a false negative rate of 0.5%.

The tree diagram to the right shows whether Olympic athletes took drugs and the likelihood of getting a positive or a negative test result from a drug test. What's the probability that an athlete who tests positive actually took drugs? We want to find  $P(\operatorname{took} \operatorname{drugs} | \operatorname{test} +)$ . By the conditional probability formula,  $r(\operatorname{took} \operatorname{drugs} | \operatorname{test} +) = \frac{P(\operatorname{took} \operatorname{drugs} \cap \operatorname{test} +)}{P(\operatorname{test} +)}$ . To find  $P(\operatorname{took} \operatorname{drugs} \cap \operatorname{test} +)$ , we multiply along the Y and + branches of the tree.  $P(\operatorname{took} \operatorname{drugs} \cap \operatorname{test} +) = (0.02)(0.995) = 0.0199$ To find  $P(\operatorname{test} +)$ , we need to calculate the probability that a randomly selected athlete gets a positive test result. there are two ways this can happen: (1) if the athlete took drugs and the test created at a randomly selected athlete gets a positive, and (2) if the athlete took drugs is positive. From the tree diagram, the desired probability is  $P(\operatorname{test} +) = (0.02)(0.995) + (0.98)(0.01) = 0.0297$   $P(\operatorname{test} +) = (0.02)(0.995) + (0.98)(0.01) = 0.0297$ That is, 67% of athletes who test provides the probability took drugs.

Is there a connection between mutually exclusive and independent? Let's start with a new chance process. Choose a U.S. adult at random. Define event *A*: the person is male, and event *B*: the person is pregnant. It's pretty clear that these two events are mutually exclusive (can't happen together)! What about independence? If you know that event *A* has occurred, does this affect the probability that event *B* happens? Of course! If we know the person is male, then the chance that the person is pregnant is 0. Since  $P(B \mid A) \neq P(B)$ , the two events are not independent. Two mutually exclusive events are never b independent. Two mutually exclusive events are not revert is guaranteed not to happen.

