

# Announcements

- ▶ Office hours are now 2-4 on Tuesdays.
- ▶ Question 4: What is the probability that AT LEAST one die lands on 1?

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- ▶ This means that the probability that he/she hits the ball is 0.333 in each at-bat.
- ▶ Assume the attempts are independent. (Reasonable?)
- ▶ If the player strikes out 10 times in a row, are they “due for a hit”?

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(False because the trials are independent; the coin knows no history.)

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Black man with beard	$1/10$
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- ▶ “Expert” claimed: to find the probability that a random couple matches all these characteristics, you multiply the individual probabilities.

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  - ▶ Multiplying probabilities works only for *independent* events!
- ▶ Maybe 1 in a million couples match these characteristics, so easily three such couples in L.A. area.
- ▶ Without more information, the probability is only about 1 in 3 that they are guilty.

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- ▶ Conviction later set aside by California Supreme Court: “trial by mathematics” .
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- ▶ Example of “prosecutor’s fallacy” : more later.

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- ▶ What is this probability if you're given that the first die shows a six?

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- ▶ Find  $P(Y|X)$ . This means...

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- ▶ 80% of the students passed the first test.
- ▶ Question: among those who passed the first test, what fraction also passed the second test?

# Multiplication rule

## Multiplication rule for conditional probabilities

For any events  $A$  and  $B$ , we have

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

so

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

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- ▶  $P(\{\text{Facebook user}\}) \approx 0.5$
- ▶ Among U.S. Facebook users, say 8% have an iPhone.
- ▶ Question: What fraction of U.S. citizens are on facebook AND have an iPhone?

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- ▶  $A$  and  $B$  are independent if  $P(A|B) = P(A)$ .
- ▶ That is,  $A$  and  $B$  are independent if knowledge of  $B$  does not affect  $A$ .