

## Deterministic versus Probabilistic

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- ▶ **Example.** Predicting the amount of money in a bank account.
  - ▶ If you know the initial deposit, and the interest rate, then:
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- ▶ You know the **likelihood** that something will happen, but you don't know **when** it will happen.
- ▶ **Example.** Roll a die until it comes up '5'.
  - ▶ Know that in each roll, a '5' will come up with probability  $1/6$ .
  - ▶ Don't know exactly when, but we can predict well.

## Basic Probability

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**Example.** The roll of the die ... [is '5'] or [is odd] or [is prime] ...

**Example.**  $p(E_1) = \text{_____}$ ,  $p(E_2) = \text{_____}$ ,  $p(E_3) = \text{_____}$ .



## Determining Probabilities

Three methods for **modeling** the probability of an occurrence:

- ▶ **Relative frequency method:**
  
  
  
  
  
  
  
  
  
  
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**Example.** Hit a bulls-eye 17 times out of 100; set the probability of hitting a bulls-eye to be  $p(\text{bulls-eye}) = 0.17$ .

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- ▶ **Subjective guess method:**

If neither method above applies, give it your best guess.

**Example.** How likely is it that your friend will come to a party?

## Independent Events

**Definition:** Two events are **independent** if the probabilities of occurrence do not depend on one another.

**Example.** Roll a red die and a blue die.

- ▶ Event 1: blue die rolls a 1. Event 2: red die rolls a 6.  
These events are independent.
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**Example.** Pick a card, any card! Shuffle a deck of 52 cards.

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**Example.** You wake up and don't know what day it is.

- ▶ Event 1: Today is a weekday.  $E_1$  vs.  $E_2$
- ▶ Event 2: Today is cloudy.  $E_2$  vs.  $E_3$
- ▶ Event 3: Today is Modeling day.  $E_1$  vs.  $E_3$

## Independent Events

- ▶ When events  $E_1$  (in  $X_1$ ) and  $E_2$  (in  $X_2$ ) are *independent* events,

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$$\begin{aligned} p(E_1 \text{ or } E_2) &= 1 - (1 - P(E_1))(1 - P(E_2)) \\ &= P(E_1) + P(E_2) - p(E_1)p(E_2) \end{aligned}$$

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**Example.** What is the probability that you roll a blue 1 OR a red 6?

**This does not work with *dependent* events.**

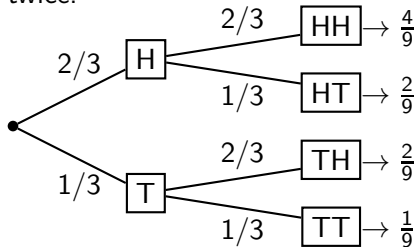
## Decision Trees

**Definition:** A **multistage** experiment is one in which each stage is a simpler experiment. They can be represented using a **tree diagram**. Each branch of the tree represents one outcome  $x$  of that level's experiment, and is labeled by  $p(x)$ .

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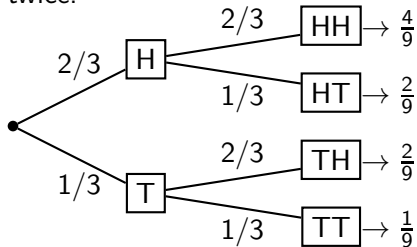


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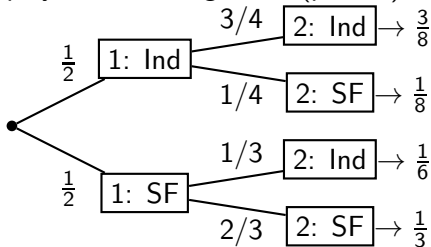
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**Example.** Indiana and SF State U. play two soccer games. (p. 382)



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**Definition:** The **expected value** or **mean** of a random variable is the sum of the numbers weighted by their probabilities. Mathematically,

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**Example.** How many wins do you expect Indiana to have?

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When two random variables are on two **independent** experiments, the expected value operation behaves nicely:

$$\mathbb{E}[X + Y] = \mathbb{E}[X] + \mathbb{E}[Y] \quad \text{and} \quad \mathbb{E}[XY] = \mathbb{E}[X]\mathbb{E}[Y].$$

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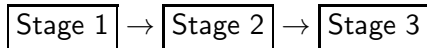
# Component Reliability

Many systems consist of components pieced together.

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To calculate **system reliability**, first determine how reliable **each component** is; then apply rules from probability.

**Example.** Launch the space shuttle into space with a three-stage rocket.



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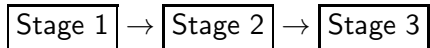
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Let  $R_1 = 90\%$ ,  $R_2 = 95\%$ ,  $R_3 = 96\%$  be the reliabilities of Stages 1–3.

$p(\text{system success}) = p(\text{S1 success and S2 success and S3 success})$

## Component Reliability

**Example.** Communicating with the space shuttle.

There are two independent methods in which earth can communicate with the space shuttle

- ▶ A microwave radio with reliability  $R_1 = 0.95$
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$$p(\text{system success}) = p(\text{MW radio success or FM radio success})$$