## 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:
- You can determine the amount in the account after one year.

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Probabilistic: Element of chance is involved

- 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

Definition: An experiment is any process whose outcome is uncertain.
Definition: The set of all possible outcomes of an experiment is called the sample space, denoted $X$ or $S$.
Definition: Each outcome $x \in X$ has a number between 0 and 1 that measures its likelihood of occurring. This is the probability of $x$, denoted $p(x)$.
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Definition: An event $E$ is something that happens (in other words, a subset of the sample space).
Definition: Given $E$, the probability of the event $(p(E))$ is the sum of the probabilities of the outcomes making up the event.

Example. The roll of the die ... [is ' 5 '] or [is odd] or [is prime] ... Example. $p\left(E_{1}\right)=$ $p\left(E_{2}\right)=$ $\qquad$
$\qquad$ .

## Determining Probabilities

Three methods for determining the probability of an occurrence:

- Relative frequency method:
- Equal probability method:
- Subjective guess method:


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- Equal probability method: Assume all outcomes have equal probability; assign as the probability $\frac{1}{\# \text { of possible outcomes }}$. Example. Each side of a dodecahedral die is equally likely to appear; decide to set $p(1)=\frac{1}{12}$.
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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.
- Event 1: blue die rolls a 1. Event 2: blue die rolls a 6. These events are dependent.


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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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p\left(E_{1} \text { and } E_{2}\right)=p\left(E_{1}\right) p\left(E_{2}\right)
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\begin{aligned}
p\left(E_{1} \text { or } E_{2}\right) & =1-\left(1-P\left(E_{1}\right)\right)\left(1-P\left(E_{2}\right)\right) \\
& =P\left(E_{1}\right)+P\left(E_{2}\right)-p\left(E_{1}\right) p\left(E_{2}\right)
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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

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Independent or dependent?

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


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This function $r$ is called a random variable.
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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\mu=\mathbb{E}[X]=p\left(x_{1}\right) r\left(x_{1}\right)+p\left(x_{2}\right) r\left(x_{2}\right)+\cdots+p\left(x_{n}\right) r\left(x_{n}\right) .
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Idea: With probability $p\left(x_{1}\right)$, there is a contribution of $r\left(x_{1}\right)$, etc.
Example. How many heads would you expect on average when flipping a biased coin twice?

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Idea: With probability $p\left(x_{1}\right)$, there is a contribution of $r\left(x_{1}\right)$, etc.
Example. How many heads would you expect on average when flipping a biased coin twice?

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

## Expected value / mean

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

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\mathbb{E}[X+Y]=\mathbb{E}[X]+\mathbb{E}[Y] \text { and } \mathbb{E}[X Y]=\mathbb{E}[X] \mathbb{E}[Y]
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| $b+^{r}$ | 1 | 2 | 3 | 4 | 5 | 6 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| 3 | 4 | 5 | 6 | 7 | 8 | 9 |
| 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| 5 | 6 | 7 | 8 | 9 | 10 | 11 |
| 6 | 7 | 8 | 9 | 10 | 11 | 12 |


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| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 1 | 2 | 3 | 4 | 5 | 6 |
| 2 | 2 | 4 | 6 | 8 | 10 | 12 |
| 3 | 3 | 6 | 9 | 12 | 15 | 18 |
| 4 | 4 | 8 | 12 | 16 | 20 | 24 |
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| 6 | 6 | 12 | 18 | 24 | 30 | 36 |

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$\mathbb{E}[X+Y]=$
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## Component Reliability

Many systems consist of components pieced together. To determine how reliable the system is, determine how reliable each component is and apply probability rules.

Definition: The reliability of a system is its probability of success.
Example. Launch the space shuttle into space with a three-stage rocket.

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\text { Stage } 1 \rightarrow \text { Stage } 2 \rightarrow \text { Stage } 3
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* In order for the rocket to launch, $\qquad$ $\star$


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Let $R_{1}=90 \%, R_{2}=95 \%, R_{3}=96 \%$ be the reliabilities of Stages $1-3$.
$p($ system success $)=p(\mathrm{~S} 1$ success and S 2 success and S 3 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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- An FM radio, with reliability $R_{2}=0.96$.
* In order to be able to communicate with the shuttle,
$p$ (system success) $=p$ (MW radio success or FM radio success)

