

# Probability and Statistics: Lecture-13

Monsoon-2020

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## » Coin Toss Example...

### Problem

A coin for which  $P(\text{Heads}) = p$  is tossed until two successive Tails are obtained. Find the probability that the experiment is completed on the  $n$ th toss.

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4. event  $E_3$  : first two tosses are  $TT$
5. event  $F_n$  : experiment completed on the  $n$ th toss.



# » Solution to problem in previous slide...part-1

$$P(F_n) = P(\underbrace{F_n}_{\text{H}} | \underbrace{E_1}_{\text{H}}) \underbrace{P(E_1)}_{\text{H}} + P(\underbrace{F_n}_{\text{H}} | \underbrace{E_2}_{\text{H}}) \underbrace{P(E_2)}_{\text{H}} + P(\underbrace{F_n}_{\text{H}} | \underbrace{E_3}_{\text{H}}) \underbrace{P(E_3)}_{\text{H}}$$

For  $n=2$   $P(F_2) = P(E_3) = (1-p)^2$

and for  $n > 2$

$$\rightarrow P(F_n | E_1) = P(F_{n-1})$$

$$\rightarrow P(F_n | E_2) = P(F_{n-2})$$

$$\rightarrow P(F_n | E_3) = 0$$

① | ---  $\dots$   $\overline{n^{th}}$

---  $\dots$   $\overline{n-1^{th}}$

TT | ---  $\dots$   $\overline{n^{th}}$   
 $n > 2$

Let  $\underline{p_n} = P(F_n)$  then  $p_2 = (1-p)^2$

$$\boxed{p_n = p_{n-1} \cdot p + p_{n-2} (1-p)p}$$

← A recurrence relation

## » Solution to problem in previous slide...part-2

$$p_n = p p_{n-1} + p(1-p) p_{n-2} ,$$

with

$$p_1 = 0$$

$$p_2 = (1-p)^2$$

To be done in tutorial

» **Solution to problem in previous slide...part-3**

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### Properties

For any events  $A$ ,  $B$ , and  $E$  we have the following:

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For any events  $A$ ,  $B$ , and  $E$  we have the following:

$$* \underline{0} \leq P(\underbrace{A \cap E}_{\text{some event}}) \leq 1 \quad (\text{axioms})$$

$A$  event  
 $B$  event  
 $A \cap B$  event

## » Properties of conditional probabilities...

### Properties

For any events  $A$ ,  $B$ , and  $E$  we have the following:

- \*  $0 \leq P(A \cap E) \leq 1$

- \*  $P(A \mid E) = 1 - P(A^c \mid E)$



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For any events  $A$ ,  $B$ , and  $E$  we have the following:

- \*  $0 \leq P(A \cap E) \leq 1$
- \*  $P(A | E) = 1 - P(A^c | E)$
- \*  $P(\underbrace{A \cap B}_{\text{orange wavy line}} | E) = P(\underbrace{B \cap A}_{\text{orange wavy line}} | E)$

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- \*  $P(A \cap B \mid E) = P(B \cap A \mid E)$
- \*  $P(\underbrace{A \cap B}_{\text{orange}} \mid E) = P(B \mid E) \underbrace{P(A \mid B \cap E)}_{\text{orange}}$

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### Properties

For any events  $A$ ,  $B$ , and  $E$  we have the following:

- \*  $0 \leq P(A \cap E) \leq 1$
- \*  $P(A \mid E) = 1 - P(A^c \mid E)$
- \*  $P(A \cap B \mid E) = P(B \cap A \mid E)$
- \*  $P(A \cap B \mid E) = P(B \mid E)P(A \mid B \cap E)$
- \*  $P(A \mid B \cap E) = \frac{P(B \mid A \cap E)P(A \mid E)}{P(B \mid E)}$

## » Scratch Space for Proving Conditional Probabilities...

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## » Conditional Independence...

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### Definition of conditional independence

Two events  $A$  and  $B$  are conditionally independent given  $E$  if

$$P(\underbrace{A \cap B}_{\text{joint}} | \underbrace{E}_{\text{condition}}) = P(\underbrace{A}_{\text{event}} | \underbrace{E}_{\text{condition}}) P(\underbrace{B}_{\text{event}} | \underbrace{E}_{\text{condition}})$$

## » Conditional Independence...

### Definition of conditional independence

Two events  $A$  and  $B$  are **conditionally independent** given  $E$  if

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

### Fact on Conditional Independence

$A$  and  $B$  independent **does not mean** that  $A$  and  $B$  are independent given  $E$ . That is,

$$\underbrace{P(A \cap B)} = \underbrace{P(A)P(B)} \not\Rightarrow P(A \cap B | E) = P(A | E)P(B | E)$$



» Quiz on independence...

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### Quiz-1

Two events  $E$  and  $F$  are **independent** if

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What is your answer?

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### Quiz-1

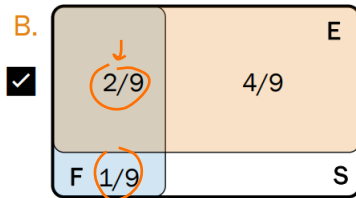
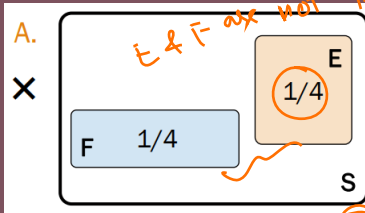
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What is your answer?

### Quiz-1

Are  $E$  and  $F$  independent in the following pictures (not to scale)?



$$P(E \cap F) = P(E) \cdot P(F) \\ \neq \frac{1}{4} \cdot \frac{1}{4}$$

$$P(F) \cdot P(E) \\ = \frac{1}{3} \cdot \frac{2}{3} = \frac{2}{9}$$

$$P(E \cap F) = \frac{2}{9}$$

$$P(F) = \frac{2}{9} \cdot \frac{1}{3} \quad P(E) = \frac{4}{9} \cdot \frac{2}{3}$$

## » Mutually Exclusive and Independent Events...

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### Quiz

When are two events both mutually exclusive and independent?

A, B

① Mut. exclusion  $\Rightarrow$

$$A \cap B = \emptyset \Rightarrow P(A \cap B) = 0 \quad \text{①}$$

② Independence  $\Rightarrow$

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

$$\Rightarrow P(A)P(B) = 0$$

$$\Rightarrow P(A) = 0 \quad \text{or} \quad P(B) = 0$$





## » Random Variables

### Examples of typed variables in C

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- \* **int** i = 4;
- \* **float** x = 10;
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Let  $X$  denote the outputs after we roll a die, then

$$X = 3$$


means that after rolling a die, we obtain 3 as output.

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### Examples of random variable

Let  $X$  denote the outputs after we roll a die, then

$$X = 3$$

*depends  
randomly*

means that after rolling a die, we obtain 3 as output.

Since the number that is going to be assigned to **variable**  $X$  is going to be **random**, it is called **random variable**.

## » Define Random Variable

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### Definition of Random Variable

A **random variable**  $X$  is a function from the sample space to the real numbers.

$$X: S \rightarrow \mathbb{R}.$$

Handwritten notes in orange:

- $\{1, 2, 3, \dots, 6\}$  (written above the  $\mathbb{R}$  in the original image)
- $R_X \subsetneq \mathbb{R}$  (written below the  $\mathbb{R}$  in the original image)

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### Examples of Random Variables...

Find the range of the following random variables:

- \* I toss a coin 10 times. Let  $X$  be the number of heads I observe

$$R_X = \{0, 1, 2, \dots, 10\}$$

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- \* I toss a coin 10 times. Let  $X$  be the number of heads I observe
- \* I toss a coin until the first tail appears. Let  $Y$  be the total number of coin tosses

$$\textcircled{Y} = \{1, 2, 3, \dots\} \subset \mathbb{R}$$



### Quiz on Random Variable

Consider and Experiment: 3 coins are flipped. Let  $X$  be the number of tails. Answer the following:

## » Quiz on Random Variable...

$$[0, 3] \quad \{0, 1, 2, 3\}$$

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Consider and Experiment: 3 coins are flipped. Let  $X$  be the number of tails. Answer the following:

\* What is the value of  $X$  for the outcomes?

- \*  $(H, H, H) \leftarrow 0$
- \*  $(\underline{T}, \underline{T}, H) \leftarrow 2$

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- \*  $(T, T, H)$

- \* ✓ What is the event when  $X = 2$ ?



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\*  $(H, H, H)$

\*  $(T, T, H)$

\* What is the event when  $X = 2$ ?

\* What is  $P(X = 2)$ ?

$\{T, T, H, H, T, T, \cancel{H, H, H}, \cancel{T, H, T}\}$   
 $X=2$   
 $T, H, T$

$$\frac{3}{8}$$

## » Random Variables are Not Events!

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$\textcircled{X} = 2 \rightarrow \text{correspond to event}$

### Remarks on Random variables

- \* random variables are **not** events!

int i  
[i = 2]

## » Random Variables are Not Events!

### Remarks on Random variables

- \* random variables are **not** events!
- \* when a random variable is **assigned** a value, then it becomes event

$X = x$	Set of Outcomes	$P(X = k)$
$X = 0$	$\{(T, T, T)\}$	$1/8$
$X = 1$	$\{(\underline{H}, T, T), (T, \underline{H}, T), (T, T, \underline{H})\}$	$3/8$
$X = 2$	$\{(H, H, T), (H, T, H), (T, H, T)\}$	$3/8$
$X = 3$	$\{(\underline{H}, \underline{H}, \underline{H})\}$	$1/8$
$X \geq 4$	$\{\}$	$0$

Consider an experiment where 3 coins are flipped, and  $X$  denotes number of heads



## » Discrete Random Variables...

Recall: countable sets

A set  $A$  is **countable** if either it is a **finite** set, or it can be put in **1-1 correspondence** with set of natural numbers.

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Types of Random Variables...

There are three types of random variables:

1. discrete random variables
2. continuous random variables

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Types of Random Variables...

There are three types of random variables:

1. discrete random variables
2. continuous random variables
3. mixed random variables

## » Examples of Types of Random Variables...

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$$0 \leq X \leq 100$$

### Examples of random variables

1. I toss a coin 100 times. Let  $X$  be the number of heads I observe

discrete

## » Examples of Types of Random Variables...

$$Y = \{1, 2, 3, \dots\}$$

$R_Y = \text{countable}$

### Examples of random variables

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3. The random variable  $T$  is defined as the time (in hours) from now until the next earthquake occurs in a certain city
4. Let  $X$  be the height of students in a class *Cont.*



## » Probability Mass Function...

Definition of probability mass function and some remarks...

Let  $X$  be a random variable with range  $R_X = \{x_1, x_2, \dots\}$ , which is finite or countably infinite.

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Let  $X$  be a random variable with range  $R_X = \{x_1, \underline{x_2}, \dots\}$ , which is **finite or countably infinite**. The function

$$\rightarrow P_X(x_k) = P(\underline{X} = \underline{x_k}), \text{ for } k = 1, 2, 3, \dots$$

is called **probability mass function (PMF)** of  $X$ .

$$\begin{aligned} &\underline{p(x)} \\ &p(X = \underline{x_k}) \end{aligned}$$

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$x, y, z$

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- \* The subscript in  $P_X(x_k)$  indicates that it is the PMF of random variable  $X$

$P_X(x_k)$   
↑  
 $x_k$

$P_X(x)$

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- \* The subscript in  $P_X(x_k)$  indicates that it is the PMF of random variable  $X$
- \* For **discrete** random variable, PMF is also called **probability distribution**
- \* The term **probability distribution function** is almost always reserved for **cumulative distribution** (to be introduced)



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### Answer

\* Sample space  $S = \{HH, HT, TH, TT\}$ . No. of heads: 0,1,2. Hence,  $R_X = \{0, 1, 2\}$

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- \* We now find the PMF of  $X$ :  $P_X(k) = P(X = k)$  for  $k = 0, 1, 2$



## » Example of PMF...

### Examples of PMF

We toss a **fair** coin twice. Let  $X$  be the random variable denoting the number of heads we observe.

1. Find the range of random variable  $X$ , i.e.,  $R_X$
2. Find the PMF of random variable  $X$

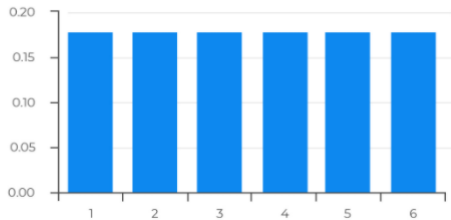
### Answer

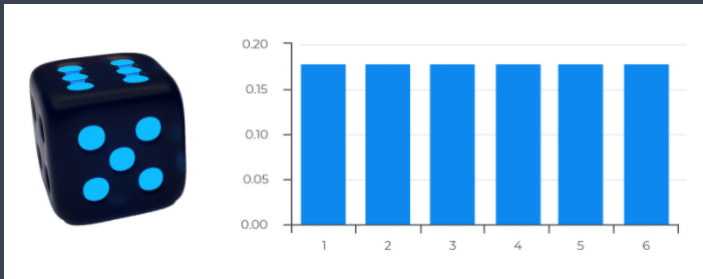
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$$\rightarrow P_X(0) = P(X = 0) = P(\underline{TT}) = 1/4 \quad \swarrow$$

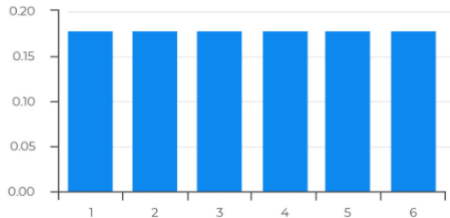
$$\rightarrow P_X(1) = P(X = 1) = P(\{HT, TH\}) = 1/4 + 1/4 = 1/2$$

$$\rightarrow P_X(2) = P(X = 2) = P(HH) = 1/4$$

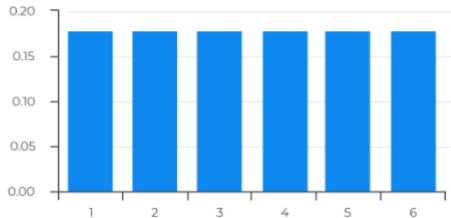




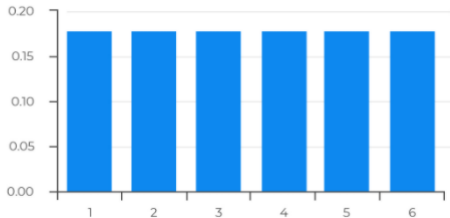
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$$P_X(x) = \begin{cases} 1/6, & x \in \{1, 2, 3, 4, 5, 6\} \\ 0, & \text{otherwise} \end{cases}$$

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### Problem on PMF

Consider an **unfair** coin for which  $P(H) = p$ .



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Consider an **unfair** coin for which  $P(H) = \underline{p}$ . We toss the coin repeatedly until we observe a head for the first time.

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### Problem on PMF

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$\{1, 2, \dots\}$

## » Example of PMF...

### Problem on PMF

Consider an **unfair** coin for which  $P(H) = p$ . We toss the coin repeatedly until we observe a head for the first time. Let  $Y$  be the total number of times the coin was tossed.

1. Is  $Y$  a discrete random variable?

yes

2. Find PMF of the random variable  $Y$

←

$$P_Y = \{1, 2, \dots\}$$

### Answer to the problem

We have

$$P_Y(1) = P(Y=1) = P(H) = p$$

$$P_Y(2) = P(Y=2) = P(\underline{TH}) = (1-p)p$$

⋮

$$P_Y(k) = P(Y=k) = P(\underline{TT \cdots TH}) = (1-p)^{k-1}p$$

$k-1$



## » Properties of PMF...

### Properties of PMF

1.  $0 \leq P_X(x) \leq 1$  for all  $x$

## » Properties of PMF...

$$X = \{1, 2, \dots, S\}$$

### Properties of PMF

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## » Properties of PMF...

$$R_X = \{x_1, x_2, \dots\}$$

### Properties of PMF

1.  $0 \leq P_X(x) \leq 1$  for all  $x$
2.  $\sum_{x \in R_X} P_X(x) = 1$
3. for any set  $A \subset R_X$ ,  $P(X \in A) = \sum_{x \in A} P_X(x)$

$$A \subset R_X$$



» **Check Properties of PMF...**

## » Check Properties of PMF...

### Problem on PMF

Consider an **unfair** coin for which  $\underbrace{P(H)} = p$ .

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Consider an **unfair** coin for which  $P(H) = p$ . We toss the coin **repeatedly** until we observe a head for the first time.

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## » Check Properties of PMF...

### Problem on PMF

Consider an **unfair** coin for which  $P(H) = p$ . We toss the coin **repeatedly** until we observe a head for the first time. Let  $Y$  be the total number of times the coin was tossed.

1. Check  $\sum_{y \in R_Y} P_Y(y) = 1$ , here  $R_Y$  is the **range** of random variable  $Y$
2. If  $p = 1/2$ , find  $P(2 \leq Y < 5)$

②

$$p = 1/2$$

$$P(2 \leq Y < 5)$$

④

$$\sum_{k=2} P_Y(k)$$

$$\sum_{k=2}^4$$

$$(1-p)^{k-1} p$$

$$= \frac{1}{2} \left( \frac{1}{2} + \frac{1}{4} + \frac{1}{8} \right) = \frac{7}{16}$$