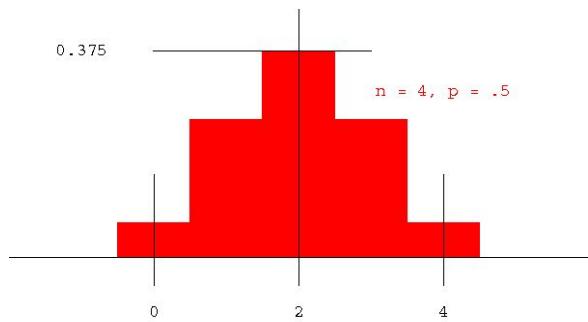
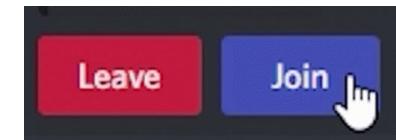


1



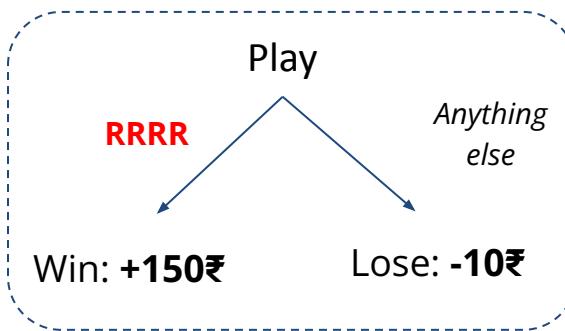
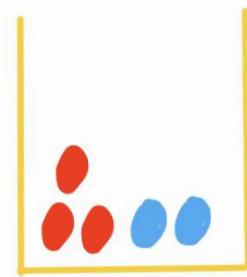
# Discrete Random Variables, PMF, CDF, Expectation



# Challenge - Decision Making

Game stall in a college fest - **3R, 2B** balls in a bag

**Rules** - *Pick a ball → Put it back → Repeat **4 times***



**Exercise - Do this activity, pass the bag to your neighbour**

**Ques 1.** Will you play this game? Will others play this?

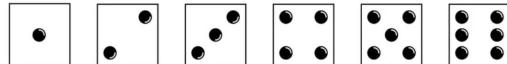
**Ques 2.** If not, for **what reward** will you be ok to play? 200₹, 500₹?

# Recap - Experiment, SS, Events



**Tossing a fair coin;**  $SS = \{H, T\}$

Events - Getting heads, tails



**Rolling a fair dice;**  $SS = \{1, 2, 3, 4, 5, 6\}$

Events - Getting a number (say 6), Getting even number



**Tossing a fair coin two times;**  $SS = \{HH, HT, TH, TT\}$

Events - At least one heads; no heads; both heads,  
Same on both tosses

1,1	1,2	1,3	1,4	1,5	1,6
2,1	2,2	2,3	2,4	2,5	2,6
3,1	3,2	3,3	3,4	3,5	3,6
4,1	4,2	4,3	4,4	4,5	4,6
5,1	5,2	5,3	5,4	5,5	5,6
6,1	6,2	6,3	6,4	6,5	6,6

**Rolling 2 die;**  $SS = 36$  possibilities

Events - Getting sum  $k$ , same no. on both dice, one of them is 6

# From Events to Random Variable



**Tossing a fair coin**

$$SS = \{H, T\}$$

$X$ = No. of Heads

Outcome	$X$ (Number of Heads)
H	1
T	0



Outcome(s)	$X$ (Same or Not)
HH, TT	1 (Same)
HT, TH	0 (Not Same)

**Tossing a fair coin two times;**  $SS =$

$$\{HH, HT, TH, TT\}$$

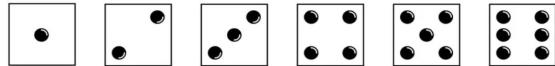
$X$ = Both toss result in same face

# From Events to Random Variable



Tossing a fair coin two times;

$$SS = \{HH, HT, TH, TT\}, X = \text{No of heads}$$



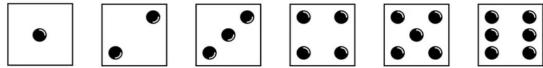
Rolling a fair dice;  $SS = \{1, 2, 3, 4, 5, 6\}$

$$X = \text{Getting 6 on the die}$$

Outcome(s)	$X$ (Number of Heads)
HH	2
HT, TH	1
TT	0

Outcome(s)	$X$ (Getting 6 or Not)
6	1 (Got 6)
1, 2, 3, 4, 5	0 (Not 6)

# From Events to Random Variable



**Rolling a fair dice;** SS = {1,2, 3, 4, 5, 6}

Outcome(s)	X (Getting Even or Not)
2, 4, 6	1 (Even)
1, 3, 5	0 (Not Even)

1,1	1,2	1,3	1,4	1,5	1,6
2,1	2,2	2,3	2,4	2,5	2,6
3,1	3,2	3,3	3,4	3,5	3,6
4,1	4,2	4,3	4,4	4,5	4,6
5,1	5,2	5,3	5,4	5,5	5,6
6,1	6,2	6,3	6,4	6,5	6,6

**Rolling 2 die;** SS = 36 possibilities

Event - Getting same number on both the die  
**RV - Same number on two die**

**Can you tabulate possible values of this RV?**  
*Left as an exercise*

# From Events to Random Variable

1,1	1,2	1,3	1,4	1,5	1,6
2,1	2,2	2,3	2,4	2,5	2,6
3,1	3,2	3,3	3,4	3,5	3,6
4,1	4,2	4,3	4,4	4,5	4,6
5,1	5,2	5,3	5,4	5,5	5,6
6,1	6,2	6,3	6,4	6,5	6,6

Outcomes (Dice Rolls)	RV Value (Same Number on Both Dice)
(1,1), (2,2), (3,3), (4,4), (5,5), (6,6)	1 (Same)
All other cases	0 (Different)

**Rolling 2 die;** SS = 36 possibilities

# From Events to Random Variable

1,1	1,2	1,3	1,4	1,5	1,6
2,1	2,2	2,3	2,4	2,5	2,6
3,1	3,2	3,3	3,4	3,5	3,6
4,1	4,2	4,3	4,4	4,5	4,6
5,1	5,2	5,3	5,4	5,5	5,6
6,1	6,2	6,3	6,4	6,5	6,6

Rolling 2 die

Event - One of them is six

**RV - No. of sixes**

Can you tabulate possible values of number of sixes?



Event - Getting sum  $k$

**RV - Sum of numbers on die**

Can you tabulate possible values of sum?

# From Events to Random Variable

1,1	1,2	1,3	1,4	1,5	1,6
2,1	2,2	2,3	2,4	2,5	2,6
3,1	3,2	3,3	3,4	3,5	3,6
4,1	4,2	4,3	4,4	4,5	4,6
5,1	5,2	5,3	5,4	5,5	5,6
6,1	6,2	6,3	6,4	6,5	6,6

**Rolling 2 die;** SS = 36 possibilities

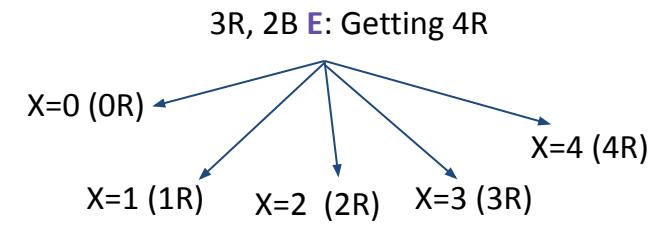
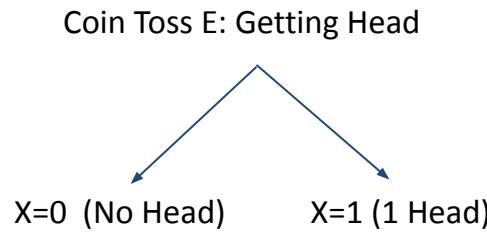
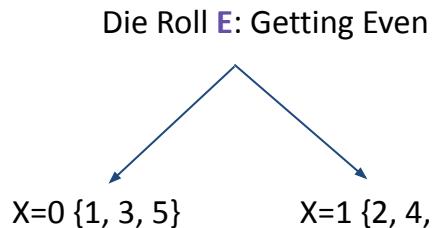
Outcomes	X (No. of sixes)
(1,1), (1,2), (1,3), (1,4), (1,5), (2,1), (2,2), (2,3), (2,4), (2,5), (3,1), (3,2), (3,3), (3,4), (3,5), (4,1), (4,2), (4,3), (4,4), (4,5), (5,1), (5,2), (5,3), (5,4), (5,5)	0
(1,6), (2,6), (3,6), (4,6), (5,6), (6,1), (6,2), (6,3), (6,4), (6,5)	1
(6,6)	2

Outcomes	Sum (k)
(1,1)	2
(1,2), (2,1)	3
(1,3), (2,2), (3,1)	4
(1,4), (2,3), (3,2), (4,1)	5
(1,5), (2,4), (3,3), (4,2), (5,1)	6
(1,6), (2,5), (3,4), (4,3), (5,2), (6,1)	7
(2,6), (3,5), (4,4), (5,3), (6,2)	8
(3,6), (4,5), (5,4), (6,3)	9
(4,6), (5,5), (6,4)	10
(5,6), (6,5)	11
(6,6)	12

# Why do we need Random Variable?

**E:** A subset of outcomes

**RV:** Assign numbers to outcomes



**Outcome/Events → Number Why??**

**E:** Descriptive (define specific outcomes)

**RV:** Analytical & computational (allows mathematical modeling)



'X = Number of Red Balls'  
**instead of**  
'X = 4 Red Balls or Not'

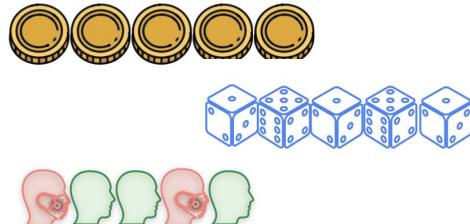
Why? Answer coming up

# Discrete Random Variable

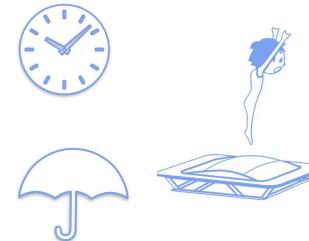
**Discrete Random Variable (DRV)** is a type of random variable that can take on a **countable number of distinct values**.

Each value has an associated probability, and the sum of all probabilities equals 1.

- Flipping  $k$  coins - **Number of heads** (0, 1, 2, 3, 4, 5, ..,k)
- Rolling  $k$  dice - **Number of 1s** (0, 1, 2, 3, 4, 5, ..,k)
- People in Hospital - **Number of sick patients** arriving in an hour (0, 1, 2, ...)



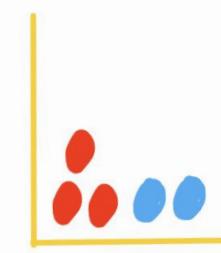
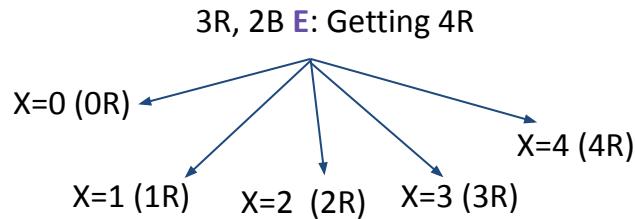
**Discrete** Random Variable



**Continuous** Random Variable

# Probability Mass Function (PMF)

# Probability Mass function

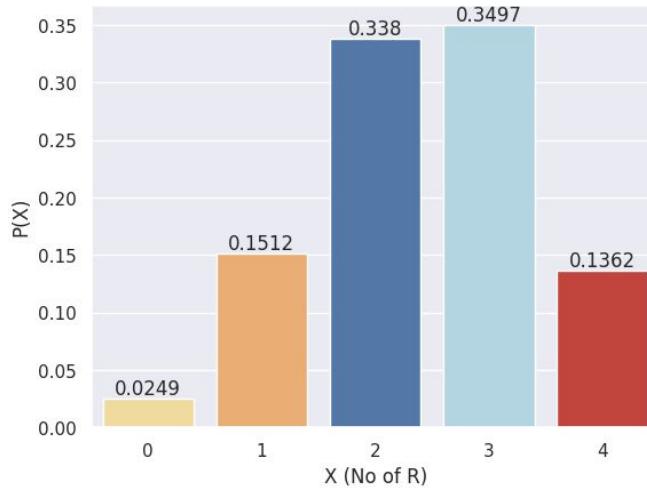


What's the probability of getting 4R balls?

$$P(X = 4) = \frac{\text{Number of students who got 4R balls}}{\text{Total number of students who played the game}}$$

P(X=0), P(X=1), P(X=2), P(X=3) - Calculate!

# Probability Mass function

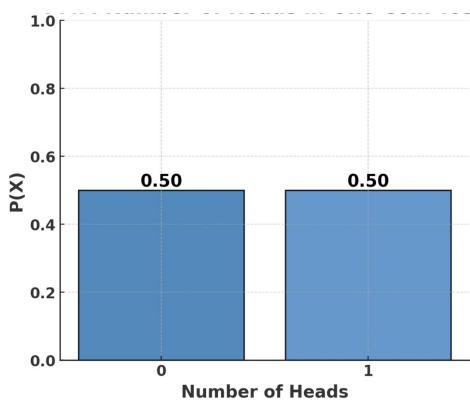


**PMF** - Function describing probability of a **discrete** random variable takes a specific value.

*Maps each possible value of a random variable to its corresponding probability of occurrence.*

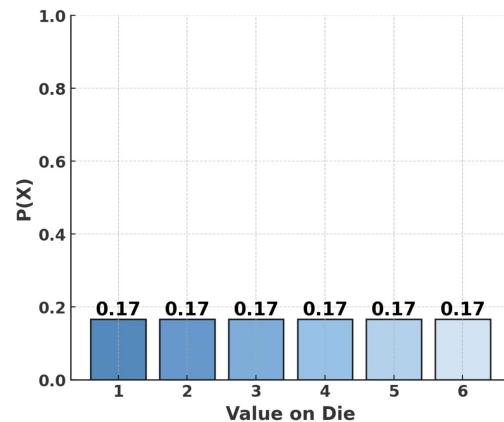
# Question: Probability Mass function

Tossing a coin;  
**E - Getting Heads**  
 $X = \text{No. of heads}$



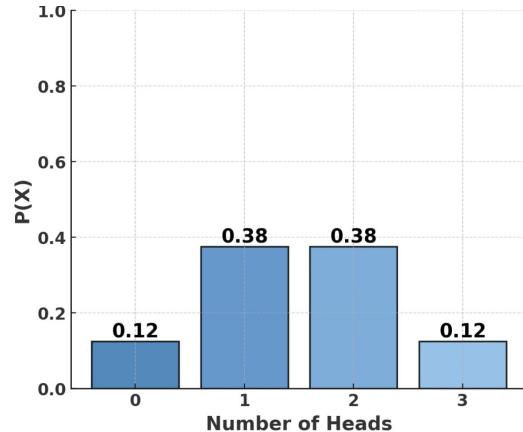
Outcomes **equally likely**

Rolling a die;  
**E - Getting 1 to 6**  
 $X = \text{Value on the die}$



Outcomes **equally likely**

Tossing 3 coins;  
**E - Getting all heads**  
 $X = \text{No. of heads}$



Outcomes **Not equally likely**

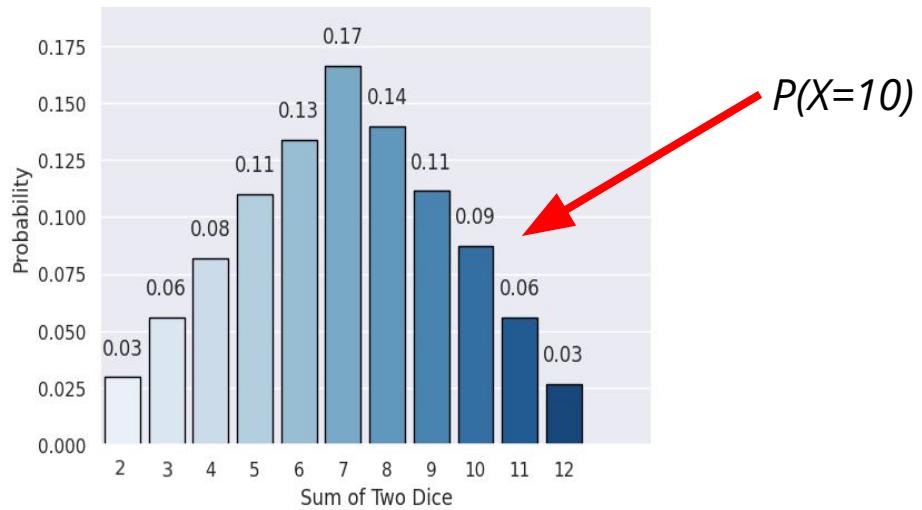
# Question: Probability Mass function

Experiment - Roll a die two times

All outcomes are ***not equally likely***

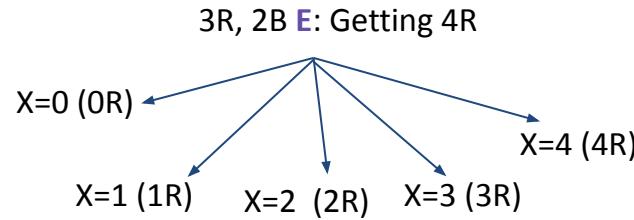
**What is your sum of values of two dice?**

**What's  $P(X=10)$ ?**



# Cumulative Distribution Function (CDF)

# Cumulative Distribution Function



**What's the probability of getting less than 2R balls?**

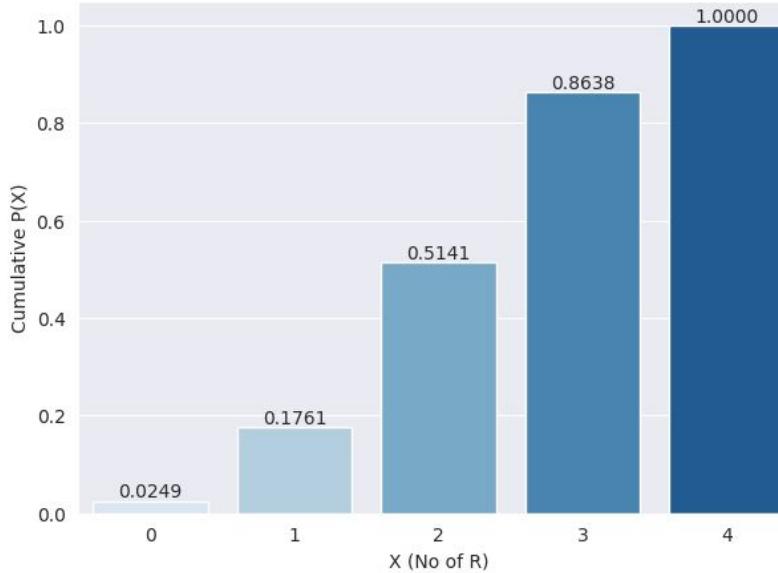
$$P(X \leq 1) = P(X = 0) + P(X = 1)$$



**What's the probability of getting upto 4 red balls?**

$$P(X \leq 4) = P(X = 0) + P(X = 1) + P(X = 2) + P(X = 3) + P(X = 4)$$

# Cumulative Distribution Function



CDF gives the probability that the random variable is less than or equal to a certain value:

$$F(x) = P(X \leq x)$$

# Cumulative Distribution Function

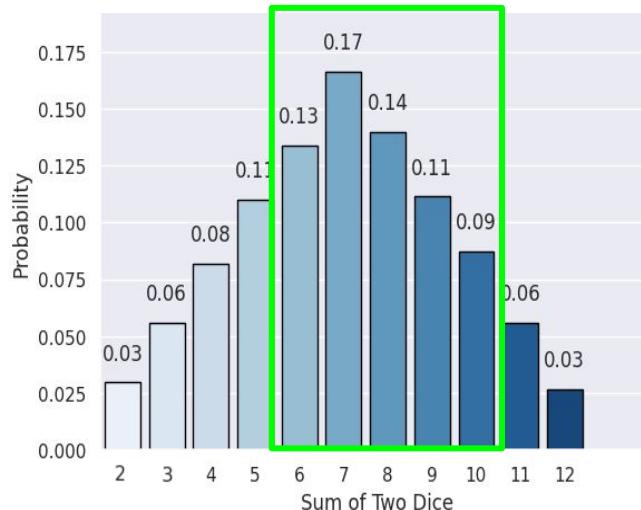
**Why CDF?** Helps us find **probabilities for range of values efficiently**

Experiment - **Rolling a die two times**

$X = \text{Sum of values on die in both throw}$

Game Rules - If sum is  
**between 6 and 10 - you win**, else you lose!!

**What's the probability of winning?**



**Calculation using PMF**

$$\begin{aligned}P(6 \leq X \leq 10) &= P(X = 6) + P(X = 7) + P(X = 8) + P(X = 9) + P(X = 10) \\&= 0.13 + 0.17 + 0.14 + 0.11 + 0.09 \\&= 0.64\end{aligned}$$

# Cumulative Distribution Function

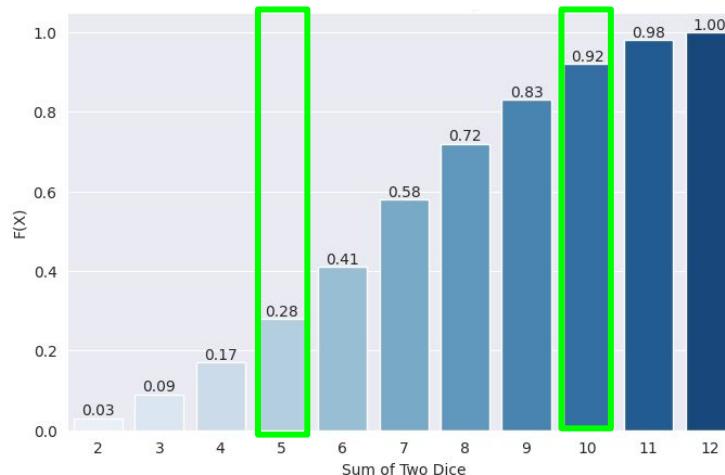
**Why CDF?** Helps us find **probabilities for range of values efficiently**

Experiment - **Rolling a die two times**

$X = \text{Sum of values on die in both throw}$

**What's the probability of winning?**

Game Rules - If sum is  
**between 6 and 10 - you win**, else you lose!!



**Calculation using CDF**

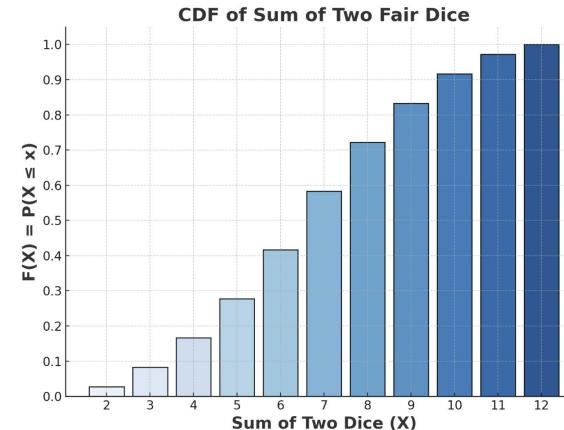
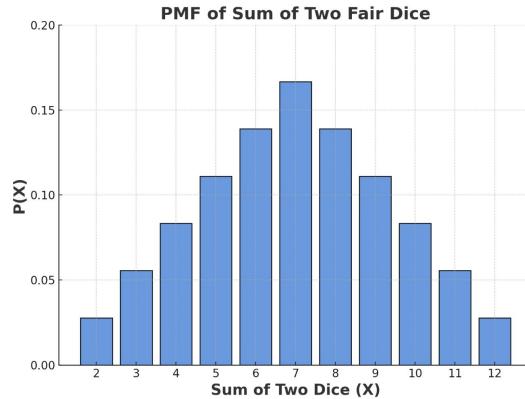
$$F(10) = 0.92, \quad F(5) = 0.28$$

$$P(6 \leq X \leq 10) = 0.92 - 0.28 = 0.64$$

**Same answer!!!**

# Summary – Discrete RV, PMF, CDF

- **Random Variable:** A numerical representation of events for analysis.
- **Discrete Random Variable (DRV):** A random variable with a **countable** set of distinct values.
- **Probability Mass Function (PMF):** A function  $P(X)$  that assigns probabilities to each DRV value.
- **Cumulative Distribution Function (CDF):** A function  $F(x) = P(X \leq x)$  giving the probability of values  $\leq x$ .



# Expectation, Expectation Value, Decision Making

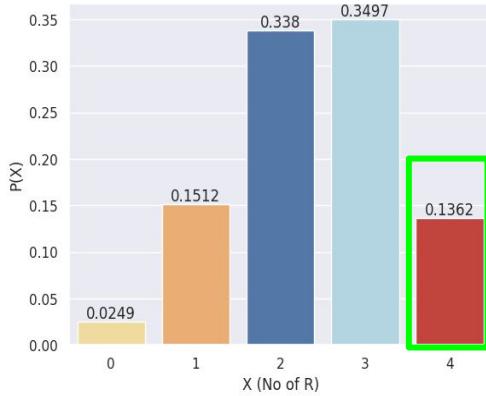
23

# Challenge – Decision Making

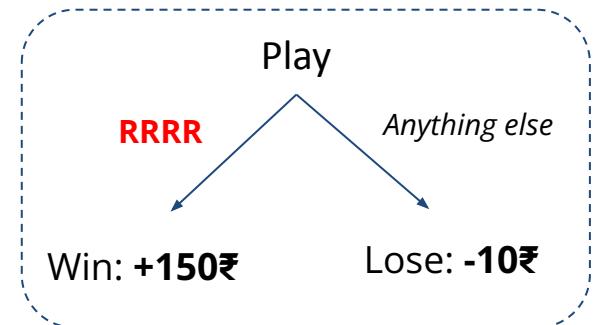
**Ques 1. Will you play this game? Will others play this?**

What's the probability of winning?

$$P(\text{RRRR}) = \text{use PMF } P(X = 4)$$



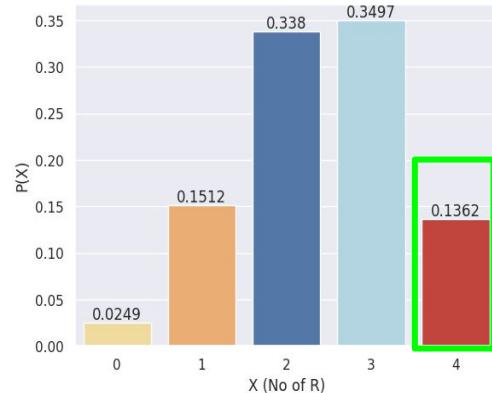
P(Win) is 0.13 (very low) but stakes are also high!



# Challenge – Decision Making

**Ques 1. Will you play this game? Will others play this?**

P(Win) is **0.13** (very low) but **stakes are also high!**



**Exercise -** How many R {0, 1, 2, 3, 4} balls will you get **at average** if you perform multiple trials?

$$\begin{aligned}0 \times 0.0249 + 1 \times 0.1512 + 2 \times 0.338 + 3 \times 0.3497 + 4 \times 0.1362 \\= 0 + 0.1512 + 0.676 + 1.0491 + 0.5448 \\= 2.4211 \approx 2.42\end{aligned}$$



We will get about **2.42 R balls per trial** if you repeat the game multiple times. Why?

# Expectation, Expected Value

We will get about **2.42 R balls per trial** if you repeat the game multiple times

**Conceptually** - Long-run average outcome of a random variable if it were to be repeated many times under identical conditions.

**Mathematically** - Sum the products of each possible outcome of the variable and its corresponding probability

$$E(X) = \sum_i x_i \cdot p_i$$

Crucial in decision-making processes. Calculating the expected outcomes for different actions, decision-makers can **choose the option with the most beneficial average result**.



# Challenge – Decision Making

Lets use concept of **Expectation** and Expected Value in calculating **Expected Earning**

Lets define  $X$  as amount earned/lost in one play

$$\begin{aligned}E(X) &= (150 \times 0.1362) + (-10 \times 0.8638) \\&= 20.43 - 8.64 \\&= 11.79\end{aligned}$$

Since, expected earning over multiple trials  $> 0$ ,  
it should be okay to play the game?

But does **+11.79 ₹** sounds rewarding to attempt  
multiple trials?

Event	X	P(X)
4R	150	0.1362
0R, 1R, 2R, 3R	-10	0.8638



**What about organisers PoV?  
Fair for them? Take home exercise**

# Additional References

## Reference Book - "A First Course in Probability" by Sheldon Ross

1. Chapter 4 - Random Variables
  - a. In Section 4.1 (Random Variable), 4.2 (Discrete Random Variable), 4.3 (Expected Values)
2. Videos
  - a. Random Variable lecture Khan Academy [Random Variable](#)
  - b. [Discrete Random Variables](#)
  - c. [Intuitive Understanding of Expectation Value](#)
  - d. [Expected Value Examples](#)
  - e. [The Most controversial Problem in Philosophy](#)
  - f. [St. Petersburg Paradox](#)
3. Blogs and articles
  - a. [MIT Lectures on Discrete Random Variable](#)
  - b. [Paradoxes for Probabilities : Expectation](#)