

A probability model requires at least two outcomes.

↳ if only one → it's deterministic model.

These outcomes collected in a set called sample space (S)

Example: * Coin Toss

Possible sample spaces

$$S = \{ \text{Heads, edges, tails} \}$$

or

$$S = \{ \text{Heads, Tails} \}$$

} Your decision.

* Triple Coin Toss

All details (Including order)

$$S = \{ \text{HHH, HHT, HTH, THH, TTH, THT, HTT, TTT} \}$$

or just the number of "Heads"

$$S = \{ 0, 1, 2, 3 \}$$

Model must fit problem!!!

* Exam Grade

$$S = \{ \text{Pass, Fail} \}$$

or

$$S = \{ 1,0; 1,3; \dots; 4,0; 5,0 \}$$

subset of the sample space

Sometimes outcomes are combined into an Event.

German Grades:

$$\text{Sehr Gut} = \{ 1,0; 1,3 \}$$

Compound Events } Contains more than one outcome

$$\text{Gut} = \{ 1,7; 2,0; 2,3 \}$$

i

$$\text{Mangelhaft} = \{ 5,0 \}$$

Elementary Event } Contains exactly one outcome

I) Special Events: {} (empty set), also \emptyset

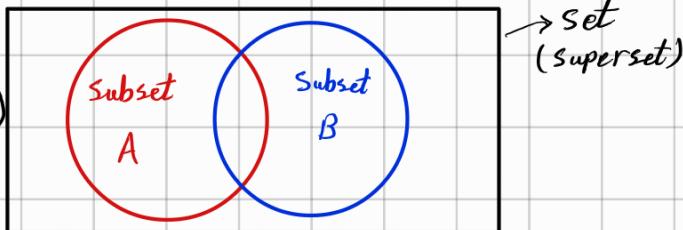
is called impossible event because at least one outcome must occur.

II) Special Events: S (whole sample space)

is called **Certain event** because whatever outcome occurs must belong to the sample space.

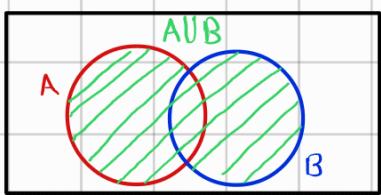
* John venn (**Venn diagrams**)

sets & Subsets (sample space & events)



We "calculate" with events (subsets) using the following operations

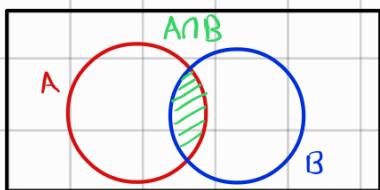
• Union: Contains all elements that belongs to A or B.



$$A \cup B = \{x \mid x \in A \text{ or } x \in B\}$$

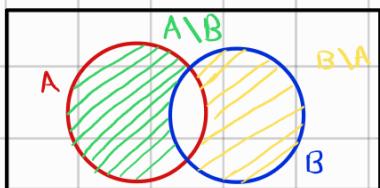
Symbol \cup as in union

• Intersection: of A & B contains all elements that belong to A & B



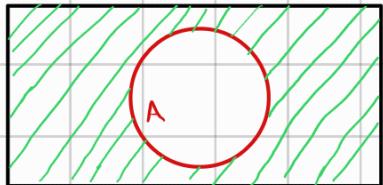
$$A \cap B = \{x \mid x \in A \text{ and } x \in B\}$$

• Difference: "A Minus B" contains all elements that belong to A but do not belong to B.



$$A \setminus B = A - B = \{x \mid x \in A, x \notin B\}$$

• Complement: of a subset contains all elements from the "super set" that do not belong to the subset.



$$\bar{A} = A' = S \setminus A$$

$$= \{x \in S \mid x \notin A\}$$

"Super set" (Sample space)

Two events (subsets) are Disjoint or Mutually exclusive if they do not have a common outcome (elements)

$$A \text{ & } B \text{ Disjoint} \iff A \cap B = \{\}$$

How do we set up a probability model?

(Step 1: Outcomes, Sample space, and events) ✓

Step 2: Assign probabilities

Answer unclear yet!

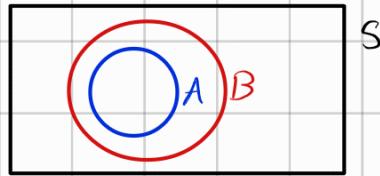
Kolmogorov Axioms

A function that assigns to each event A of a given sample space, a number $0 \leq P(A) \leq 1$

Can be considered a **probability distribution** if:

(i) $A \leq B \Rightarrow P(A) \leq P(B)$

If the event B contains all the outcomes of event A , then B is at least as likely to occur as A .



(ii) $P(\{\}) = 0 ; P(S) = 1$

(iii) If A_1, A_2, \dots are pairwise disjoint events, $A_i \cap A_j = \{\}$, $i \neq j$,

Then, the probabilities add $P(A_1 \cup A_2 \cup \dots) = P(A_1) + P(A_2) + \dots$

[Finite sum or infinite sum]

Simple consequences

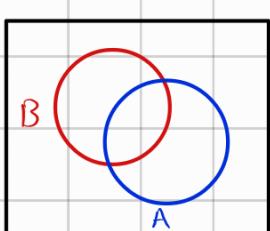
Important rules:

Let A be any event. Then $A \cap \bar{A} = \{\}$ and $A \cup \bar{A} = S$.

Therefore

$$1 = P(S) = P(A \cup \bar{A}) = P(A) + P(\bar{A}) \implies P(\bar{A}) = 1 - P(A)$$

Difference of events



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

$$\implies P(B \setminus A) = P(B) - P(A \cap B)$$

Probability of unions (not necessary disjoint)

Trick: use Disjoint parts A and $B \setminus A$

$$\Rightarrow P(A \cup B) = P(A \cup (B \setminus A))$$

$$P(A \cup B) = P(A) + P(B \setminus A)$$

$$P(A \cup B) = P(A) + P(B) - P(A \cap B)$$

Note: When A & B are disjoint $P(A \cap B) = 0$

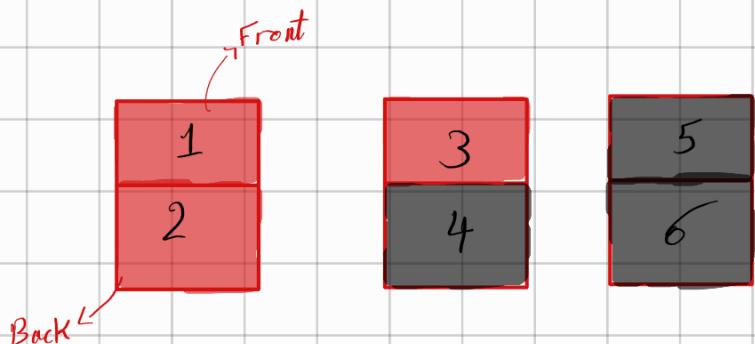
How do we assign concrete probabilities?

- Symmetry Arguments. (Laplace Assumption)

There is no reason to believe that the outcome of having Head is more likely to occur than having a Tail when Tossing a Fair Coin.

- Relative Frequencies of past data.

- Subjective choice.



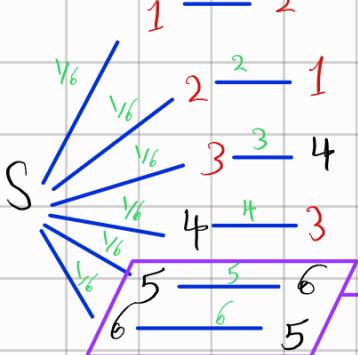
$$\text{Sample space } S = \{1, 2, 3, 4, 5, 6\}$$

$$1. P(\text{Front} = \text{Black}) = \frac{3}{6} = 0.5 = 50\%$$

$$2. P(\text{Back} = \text{Black}) = \frac{3}{6} = 0.5 = 50\%$$

3. $P(\text{Back} = \text{Black} | \text{Front} = \text{Black})$ = the probability of having a Black back card given that the front is Black.

$$3) \rightarrow P(B = B | F = B) = \frac{P(B = B \cap F = B)}{P(F = B)} = \frac{\frac{2}{6}}{\frac{3}{6}} = \frac{2}{3} = 66.7\%$$



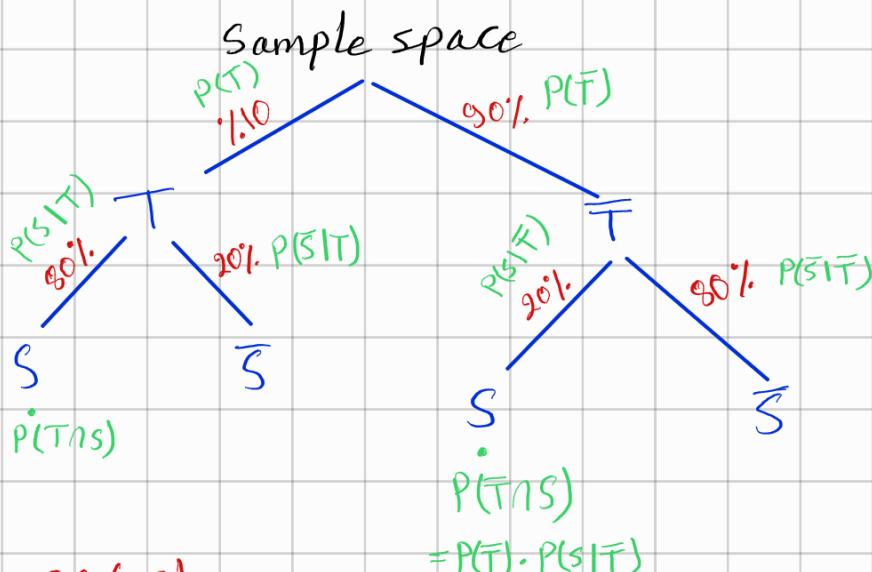
$$\text{Conditional probability: } P(A | B) = \frac{P(A \cap B)}{P(B)}$$

Where $P(A)$ & $P(B)$ are unconditional probability

FICTIONAL EXAMPLE THE MANAGEMENT OF
 A COMPANY KNOWS FROM HISTORICAL DATA
 THAT 10% OF THE EMPLOYEES ARE
 STEALING FROM THE COMPANY. TO FIND
 OUT WHO ARE THE THIEVES THEY PERFORM
 A LIE DETECTOR TEST. ACCORDING TO
 THE MANUAL THE TEST IS 80% RELIABLE.
 WHAT IS THE PROBABILITY THAT AN HONEST
 EMPLOYEE IS FALSELY ACCUSED?

T = "The randomly chosen employee is a thief"

S = "The lie detector test suspects the (randomly chosen) employee
 to be a thief"



$$P(\bar{T}|S) = \frac{P(\bar{T} \cap S)}{P(S)}$$

$$= \frac{P(\bar{T}) \cdot P(S|\bar{T})}{P(\bar{T} \cap S) + P(T \cap S)} = \frac{0.9(0.2)}{0.9(0.2) + 0.1(0.8)}$$

$$\approx 0.6923 = 69.23\%$$

Random variable: Describes a random experiment whose outcomes are real numbers.

Example: Roll a 20-sided die:-

Sample space $S = \{1, 2, \dots, 20\}$

$X = \text{"The result of rolling a 20-sided die"}$ is a random variable.

Custom: Use Capital letter for R.V. and corresponding small letters for results. ($x_1 = 7, x_2 = 13, \dots$)

Example: Production of Metal Bolts:-

L : "Length of a produced bolt in mm"

Sample space $S = [49, 51]$

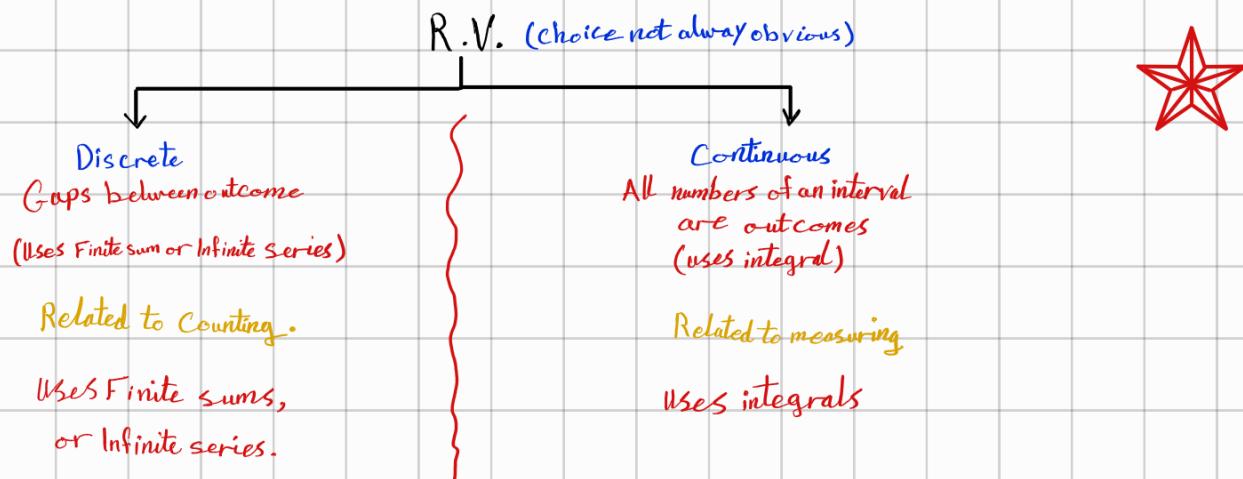
All infinitely many values of an interval may be outcomes of a random variable.

Example: Accidents in a company:-

A : "Number of work-related accidents in a year"

Sample space $S = \{0, 1, 2, 3, 4, \dots\}$

Infinitely many outcomes, but with gaps between the outcomes (not an interval).



To describe a discrete R.V completely, we need the outcomes and their probabilities.

This is called the Distribution of the R.V

X	$P(X=x)$
1	$P(X=1)$
0	$1 - P(X=1)$

"Success probability"
"Failure probability"

Example: Continuous R.V.

City of Utopia; Bus arrives every 20 minutes. We arrive "Randomly" at the bus station. How long do we have to wait for the next bus?

W = "Waiting time in minutes until the next bus arrives"

Sample space $S = [0, 20]$

Laplace assumption: No reason to believe that any outcome is more likely to happen than the others.

$$\Rightarrow P(W \leq 20) = 1$$

$$P(W \leq 10) = 0.5$$

$$P(W \leq 5) = 0.25$$

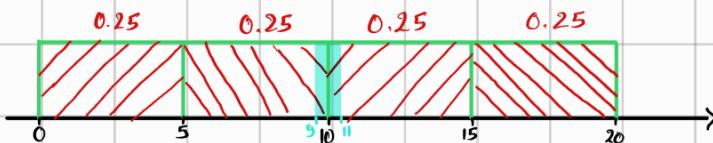
$$P(5 < W \leq 10) = 0.25$$

$$P(10 < W \leq 15) = 0.25$$

$$P(15 < W \leq 20) = 0.25$$

Grouping &

Histogram



$$P(0 < W \leq 1) = 0.1$$

$$P(0.5 < W \leq 1.5) = 0.05$$

$$P(0.75 < W \leq 1.25) = 0.025$$

$P(W=10)=0$ \Rightarrow For Continuous R.V., the probability of an elementary event is zero

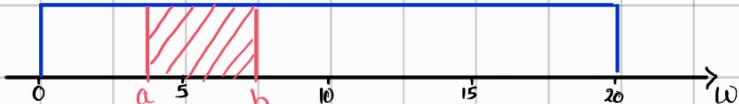
Two ways of visualization for the distribution of a continuous R.V.

1) Probability Density Function (PDF) [Probability Histogram]

2) Cumulative Distribution Function (CDF)

Always consider both.

* Probability Density Function (PDF):

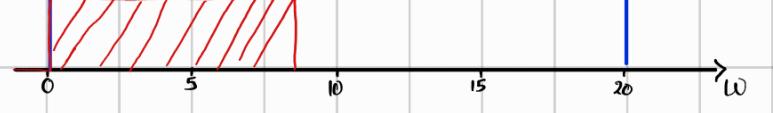


The probability is given by the area

$$P(a \leq W \leq b) = \int_a^b f(w) dw$$

PDF
Probability

- Integration converts the PDF into CDF: $F(w) = \int_{-\infty}^w f(x) dx$



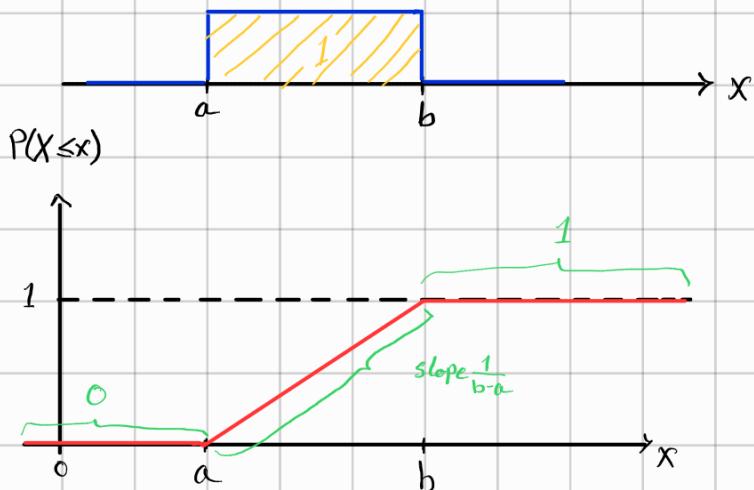
$$F(w) = P(W \leq w)$$

→ The Pdf is the derivative of the Cdf:

$$f(w) = F'(w) = \frac{d}{dw} P(W \leq w)$$

$$\text{Also } P(a < W \leq b) = \int_a^b f(w) dw = \int_{-\infty}^b f(w) dw - \int_{-\infty}^a f(w) dw = P(W \leq b) - P(W \leq a) = F(b) - F(a)$$

Uniform Continuous Distribution on $[a, b]$



$$\text{Pdf } f(x) = \begin{cases} \frac{1}{b-a}, & \text{if } a \leq x \leq b \\ 0, & \text{otherwise} \end{cases}$$

$$\text{Cdf } F(x) = \begin{cases} 0, & \text{if } x < a \\ \frac{x-a}{b-a}, & \text{if } a \leq x \leq b \\ 1, & \text{if } b < x \end{cases}$$

* Since $P(X=c) = \int_c^c f(x) dx = 0$

→ $P(a \leq X < b) = P(a \leq X \leq b) = P(a < X \leq b) = P(a < X < b)$

A Pdf $f(x)$ must satisfy:

- (i) $f(x) \geq 0$ for all x) Both properties are directly related
- (ii) $\int_{-\infty}^{+\infty} f(x) dx = 1$) to Kolmogorov's Axioms.

Exercise: A Beverage bottle is filled with $(500 + X)$ ml, where X is a random variable.

The pdf of X is $f(x) = 0.006(25-x^2)$ for $-5 \leq x \leq 5$ and $f(x)=0$ otherwise.

a) Check that f is a Pdf

b) Find the Cdf and sketch both functions.

c) Find the number c such that there is 95% probability of the bottle having a content between $(500 - c)$ ml and $(500 + c)$ mL

$$\text{a) } f(x) = \begin{cases} 0.006(25-x^2) & \text{for } -5 \leq x \leq 5 \\ 0 & \text{otherwise} \end{cases}$$

