

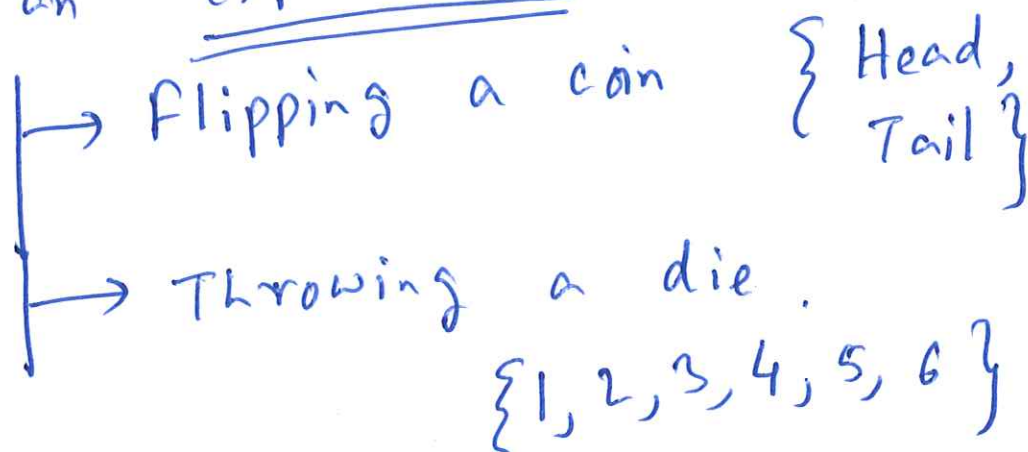
# Probability and Stochastic Processes

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## Sample Space

Doing an experiment.



A set of all possible outcomes of an experiment is called the sample space.

(2)

Book:  
Mathematical Statistics and  
Data Analysis  
— John Rice.

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Example: Earthquake modeling

We try to model the length of time between two successive earthquakes.

Sample space = All positive ( $t \geq 0$ ) numbers.

$\Omega$

$$\Omega = \{t \mid t \geq 0\}$$

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Example: Tossing two coins

$$\Omega = \left\{ \begin{array}{l} HH, \\ HT, \\ TH, \\ TT \end{array} \right\}$$

Head = H  
Tail = T.

~~These~~

Three coins

$$\Omega = \{ \begin{array}{l} \checkmark H H H, \\ \checkmark H H T, \\ \checkmark H T H, \\ H T T, \\ T H H, \\ T H T, \\ T T H, \\ T T T \end{array} \}$$

Events:

Subset of a sample space.

Example: Tossing three coins and getting first outcome = H.

$$E' = \{ H H H, H H T, H T H, H T T \}$$

(4)

## Probability

A probability measure on  $\Omega$  is a function  $P$  from subsets of  $\Omega$  to the real numbers that satisfies the following axioms.

✓ (1)  $P(\Omega) = 1$

✓ (2) If  $A \subset \Omega$ , then  $P(A) \geq 0$

✓ (3) If  $A_1$  and  $A_2$  are disjoint ( $A_1 \cap A_2 = \emptyset$ )

then  $P(A_1 \cup A_2) = P(A_1) + P(A_2)$

[ If  $A_1, A_2, \dots, A_n, \dots$  are mutually disjoint sets, then

$$P\left(\bigcup_{i=1}^{\infty} A_i\right) = \sum_{i=1}^{\infty} P(A_i) ]$$

Property 1:

$$P(A^c) = 1 - P(A)$$

Proof:

$$\Omega = A \cup A^c$$

$$P(\Omega) = P(A \cup A^c)$$

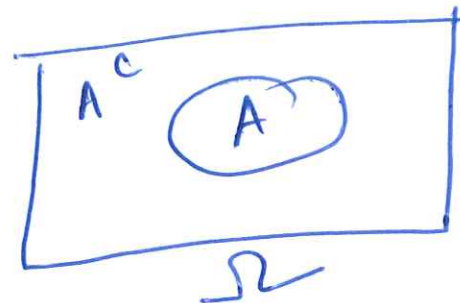
// by (3)

by (1) //

$$1 = P(A) + P(A^c)$$

$$P(A^c) = 1 - P(A)$$

(Done)



Property 2:  $P(\phi) = 0$

Proof:

Note that

$$\Omega^c = \phi$$

So, by

"Property 1"

$$P(\Omega^c) = 1 - P(\Omega)$$

// by (1)

$$P(\phi) = 0$$

(Done)



Property 3:

If  $A \subset B$ , then  $P(A) \leq P(B)$

Proof:

$$B = A \cup (B \cap A^c)$$

(Disjoint)

$$P(B) = P(A \cup (B \cap A^c))$$

$\downarrow$   
(by (3))

$$= P(A) + P(B \cap A^c)$$

$\geq 0$

(by (2))

$\Rightarrow$

$$P(B) \geq P(A)$$

(Done)

Property 4:  $P(A \cup B) = P(A) + P(B) - P(A \cap B)$

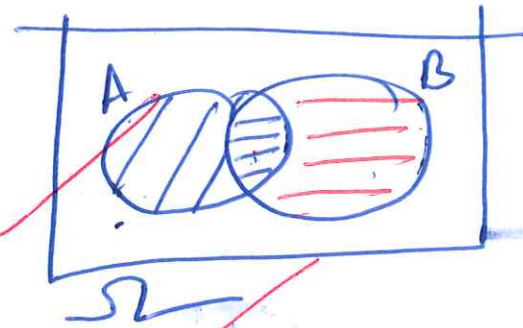
Proof:

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

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

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

$$P(B) = P(B \setminus A) + P(A \cap B) \dots (2)$$



(7)

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

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

$$= \cancel{(P(A) - P(A \cap B))} + P(A \cap B) + P(B \setminus A)$$

by (1)

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

by (2)

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

$$P(A \cup B) = P(A) + P(B) - P(A \cap B) \quad \underline{\underline{\text{(Done)}}}$$

## Computing Probabilities

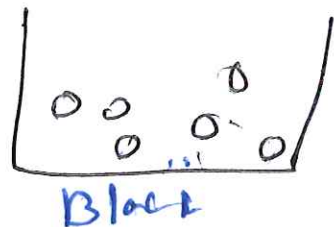
If  $A$  can occur in any of  $n$  mutually exclusive ways out of a total  $N$  ways, then

$$P(A) = \frac{n}{N}$$

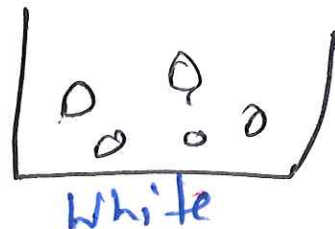
$$P(A) = \frac{\text{number of ways } A \text{ can occur}}{\text{total number of outcomes}}$$

Example:

A black urn contains  
5 red and 6 green balls.



A white urn contains  
3 red and 4 green balls.

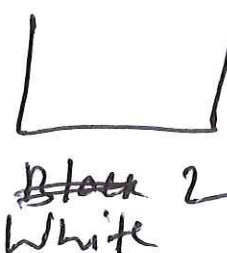


If you choose a red ball, you  
get a prize!

If the black urn is chosen,  
prob. of getting red ball =  $\frac{5}{11} \approx 0.45$

If the white urn is chosen,  
prob. of getting red ball =  $\frac{3}{7} \approx 0.42$

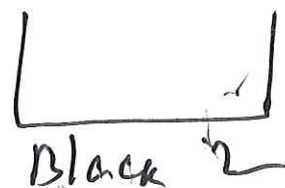
A ~~black~~<sup>white</sup> urn containing  
9 red balls and 5 green balls.



A black ~~white~~ urn contains

6 red balls and 3 green balls

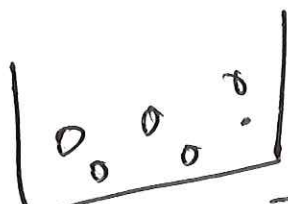
$\rightarrow P(R) = \frac{6}{9} \approx 0.667$





Final step:

Mix the balls of black urns  
in a single black urn

  
Black

5 red balls + 6 green balls  
6 red balls + 3 green balls

11 red balls + 9 green balls

$$P(R) = \frac{11}{20} = 0.55$$

Do the same for the white  
urn

  
White

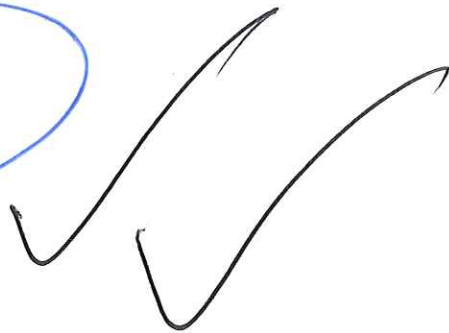
3 red balls + 4 green balls

9 red balls + 5 green balls

12 red balls + 9 green balls

$$P(R) = \frac{12}{21} = 0.57$$

Choose  
White urn



# Multiplication Principle

## Example:

In a class 12 white students,  
18 black students.

A teacher selects 1 white and  
1 black student to act as  
a class representative.

How many ways?

$$12 * 18 = \boxed{216}$$

## In general:

If one experiment has  $m$  outcomes  
and another experiment has  $n$   
outcomes, then there are  $mn$  possible  
outcomes for the two experiments.

Example: 8-bit binary word.  
→ How many?

$$\underline{2 * 2 * 2 * 2 * 2 * 2 * 2} = 2^8 = 256 //$$

## Permutation:

For a set of size  $n$ , and a sample of size  $r$ , there are  ${}^n P_r$  different ORDERED samples without replacement,

$${}^n P_r = \frac{n!}{(n-r)!} = n \cdot (n-1)(n-2) \dots \dots (n-r+1)$$

Example: 10 children

Five of them are to be chosen and lined up.

How many ways?

$${}^{10} P_5 = 10 * 9 * 8 * 7 * 6 = \underline{\underline{30240}}$$

$$\begin{array}{r} 10 \\ \hline 9 \\ \hline 8 \\ \hline 7 \\ \hline 6 \\ \hline \end{array}$$

# Example: (Birthday - Problem)

Suppose that a room contains 23 students.

What is the probability that at least two of them have a common birthday?

Solution:

A : ~~None~~ Required

$A^c$  = No two students will have same birthday

$A^c$  can happen in how many ways?

$$365 P_{23}$$

The way all possible outcome can happen is  $= (365)^{23}$

$$\checkmark P(A^c) = \frac{365 P_{23}}{(365)^{23}} = \frac{365!}{(365-23)! (365)^{23}}$$

$$\checkmark P(A) = 1 - P(A^c) = 1 - (\dots) = \underline{\underline{0.507}}$$



In general

$n$ : students

Question: What is the probability that at least two of them have a common birthday?

Answer:

$A$ : event in question

$A^c$ : None of the students share birthday.

$$P(A^c) = \frac{365 P_n}{(365)^n}$$

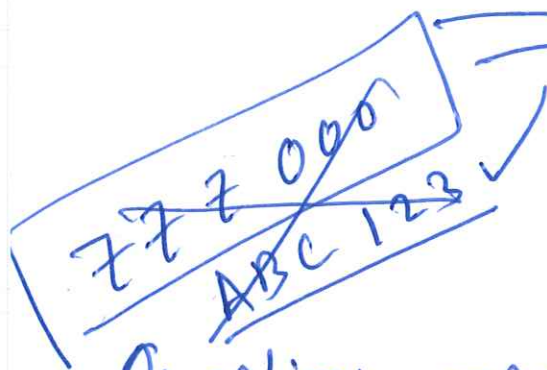
$$P(A) = 1 - P(A^c) = 1 - \frac{365 P_n}{(365)^n}$$

$n$	$P(A)$
4	0.016
16	0.284
23	0.507
32	0.753
40	0.891
56	0.988

# License plate problem



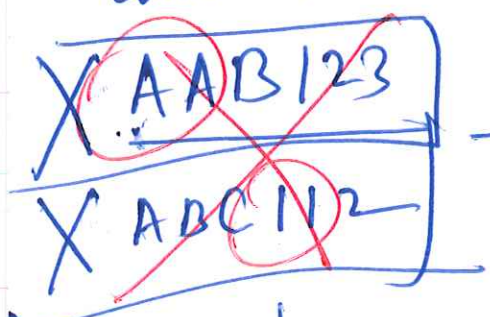
How many distinct such plates are possible?



$$26^3 * 10^3 = \checkmark \checkmark 7,576,000$$

Question: If all sequences of six characters are equally likely,

what is the probability that the license plate for a new car will contain NO duplicate letters or numbers?



Answer:

$$P(A) = \frac{26P_3 * 10P_3}{17,576,000}$$

The outcomes favorable to event

Total possible outcomes,

$$= 0.64$$

## Combination

The number of UNORDERED  
samples of  $r$  objects from  
 $n$  objects without replacement

$$\text{is } \binom{n}{r} = \binom{n}{r} C_r$$

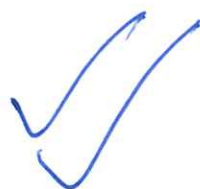
$$= \frac{n!}{r! (n-r)!}$$

Example: "California jack pot"

Until 1991: Jackpot if 6 #s  
#s from 1 to 49  
were chosen correctly.

# : number

$\{7, 6, 8, 23, 48, 12\}$



$\{n_1, n_2, n_3, n_4, n_5, n_6\}$

There are  $\binom{49}{6}$  ways of  
choosing 6 numbers from 49  
numbers.

$$\text{Chance} = \frac{1}{13,983,816}$$