

PROBABILITY & STATISTICS

Lecture 1 – Intro & Combinatorics review

PLAN FOR TODAY

1. Quick intro
2. Course overview + Entry test
3. Combinatorics review
 - *Basic counting principles*
 - *Inclusion-Exclusion*
 - *Permutations and combinations*

Intro & Logistics

ABOUT THE COURSE

- January 9 – January 27
- 17:00 – 20:20 Barcelona time
 - *slight changes are possible,
I will let you know in advance*
- On-campus and online

ABOUT ME

- EVGENIYA Korneva



evgeniakorneva@gmail.com

📍 Prague, Czech Republic

- Education:

- 2015 - Bachelor of Applied Mathematics
(Moscow, Russia)

- 2016 - Master of Artificial Intelligence
(Leuven, Belgium)

- 2016 - ... Doctoral researcher at KU Leuven

- 2021 - ... Data Scientist at ACMetric



NATIONAL RESEARCH
UNIVERSITY



ABOUT YOU

- 7 students from 5 different countries
- Bachelor's *and* master's students
- CS, Cybersecurity and Data Science tracks

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- Main topics covered:
 - Probability:
 - basic combinatorics and probability review
 - discrete and continuous random variables and their properties
 - Statistics:
 - estimators
 - confidence intervals
 - hypothesis testing

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- Final grade:
 - 40% graded assignments
 - 30% interim exam (Probability)
 - 30% final exam (Statistics)
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 - basic combinatorics and probability review
 - discrete and continuous random variables and their properties
 - Statistics:
 - estimators
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JOIN OUR GOOGLE CLASSROOM!

- Class materials and graded assignments will be posted there.
- Invites has been sent out, check your inbox.

PLEASE TAKE THE ENTRY TEST

- **NOT** graded
- Would help me adapt the materials
- Link also in Google classroom



Intro to Probability

Combinatorics review

MOTIVATION

- Some things in the world are random
 - flipping a coin;
 - roll of a die;
 - picking a random card from a shuffled deck of cards.
- Probability theory: explain the unpredictable.

IT ALL STARTED WITH GAMBLING...



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*If a die is rolled four times, it's
more likely that 6 would
occur at least once
than not at all*

IT ALL STARTED WITH GAMBLING...



If a die is rolled four times, it's more likely that 6 would occur at least once than not at all

I should talk to mathematicians about that!

... AND WAS FORMALIZED RECENTLY

MID 17th CENTURY



Fermat



Pascal

... AND WAS FORMALIZED RECENTLY

MID 17th CENTURY



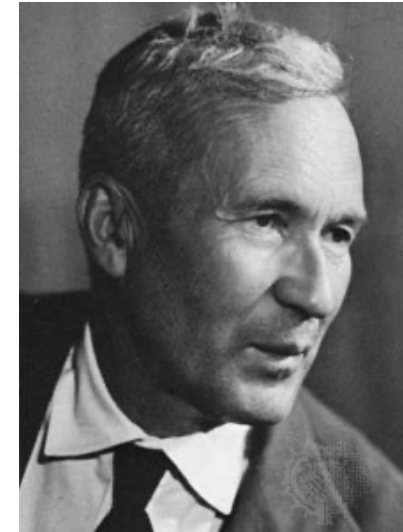
Fermat



Pascal



MID 20st CENTURY



Kolmogorov

PROBABILITY IS EVERYWHERE

“Novak Djokovic will probably win Australian Open 2023”

“There is a 70% chance of rain”

“This test gives correct result with 99.9% accuracy”

“I will probably never become a US president”

INTERPRETATION DIFFERS

PROBABILITY AS LIMITING FREQUENCY

If the same experiment is repeated infinitely many times, how often does the event happen?

- *This test gives correct result with 99.9% accuracy*
- *There is a 70% chance of rain*

PROBABILITY AS DEGREE OF BELIEF

How much are you *certain* in something?

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- The result of a random experiment is called the **outcome**.
- The set of all possible outcomes is called the **sample space** (denoted by S).

RANDOM EXPERIMENTS: EXAMPLES

- Random experiment: flipping a coin once
Sample space: $\{H, T\}$
Outcome: H (we've got heads)

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Sample space: $\{HH, HT, TH, TT\}$
Outcome: HT (we've got heads and tails)

RANDOM EXPERIMENTS: EXAMPLES

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Sample space: $\{H, T\}$
Outcome: H (we've got heads)
- Random experiment: flipping a coin twice.
Sample space: $\{HH, HT, TH, TT\}$
Outcome: HT (we've got heads and tails)
- Random experiment: rolling a die
Sample space: $\{1, 2, 3, 4, 5, 6\}$
Outcome: 5

EVENT

- Each subset of a sampling space is called an **event** (denoted by E).

Example: rolling a die

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

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$E_1 = \{1\}$ – we've got number 1.

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

$E_1 = \{1\}$ – we've got number 1.

$E_2 = \{2, 4, 6\}$ – we've got an even number.

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$E_3 = \{3, 5\}$ – we've got 3 or 5.

What is probability

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- Pascal and Fermat defined probability when a game is repeated a large number of times under the same conditions.

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- Probability of an event is defined by the **limiting frequency** with which this event appears in a long series of similar experiments.
- Example:
If we flip a fair coin infinitely many times, it will come up heads half of the times.

COMPUTING PROBABILITY

- If a sample space S is finite, and each outcome is equally likely, then probability of an event E can be computed as

$$P(E) = \frac{\# \text{ ways } E \text{ can occur}}{\# \text{ possible outcomes}} = \frac{|E|}{|S|}$$

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$$E_2 = \{1, 3, 5\}, \quad |E_2| = 3, \quad P(E_2) =$$

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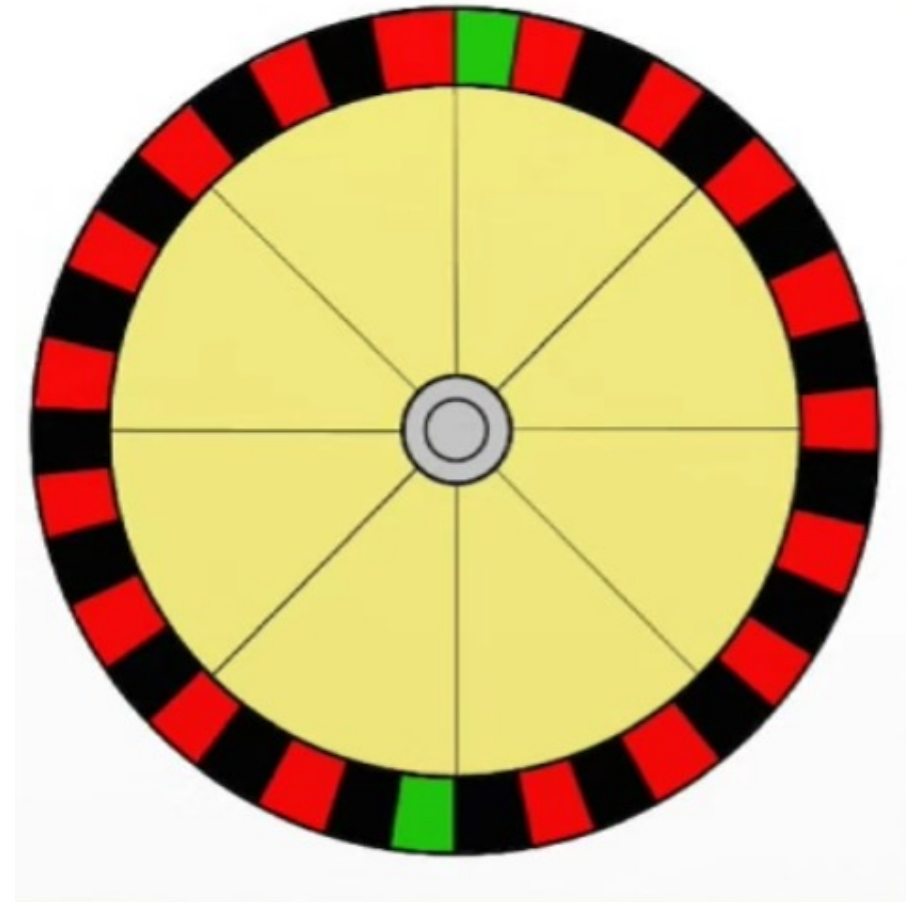
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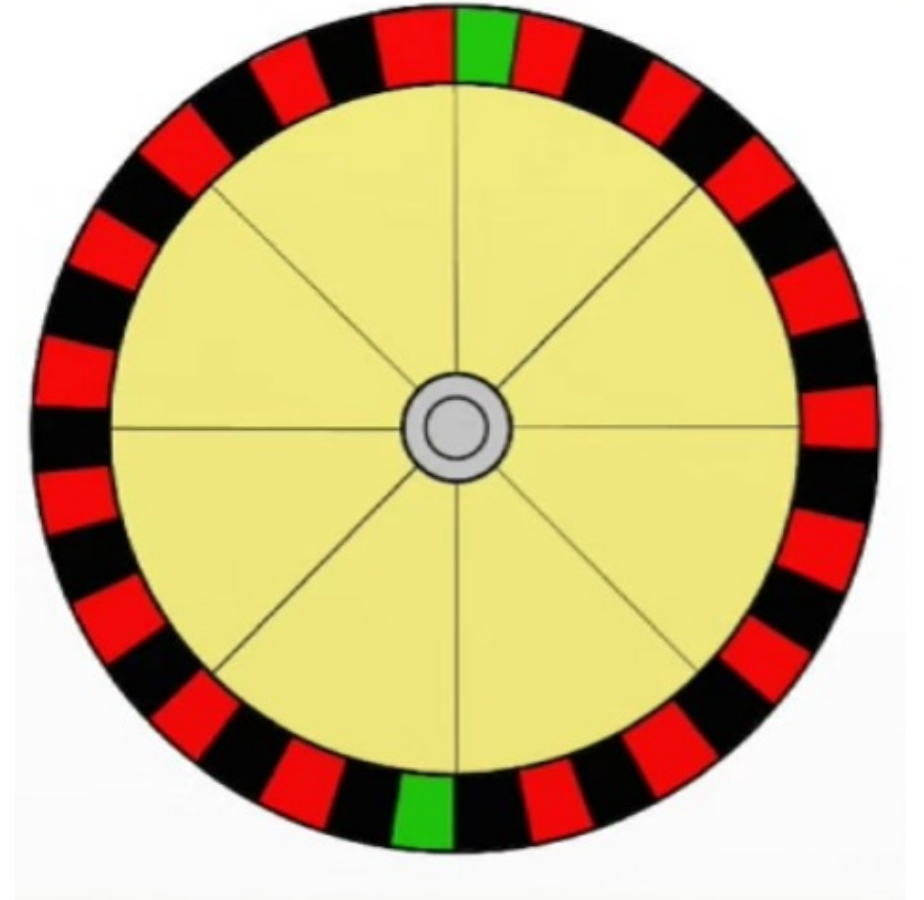
ROULETTE

- American roulette: 38 sectors
 - 18 red
 - 18 black
 - 2 green (0 and 00)
- What is the probability to win if you
 - Bet on red
 - Bet on black
 - Bet on green



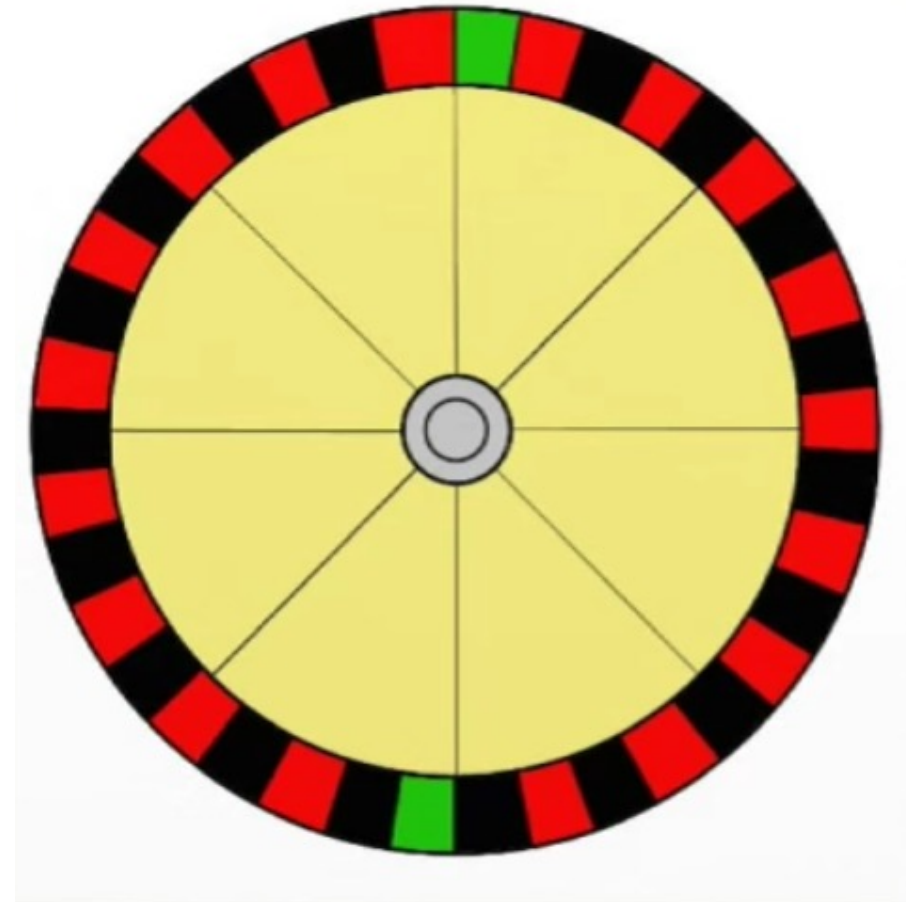
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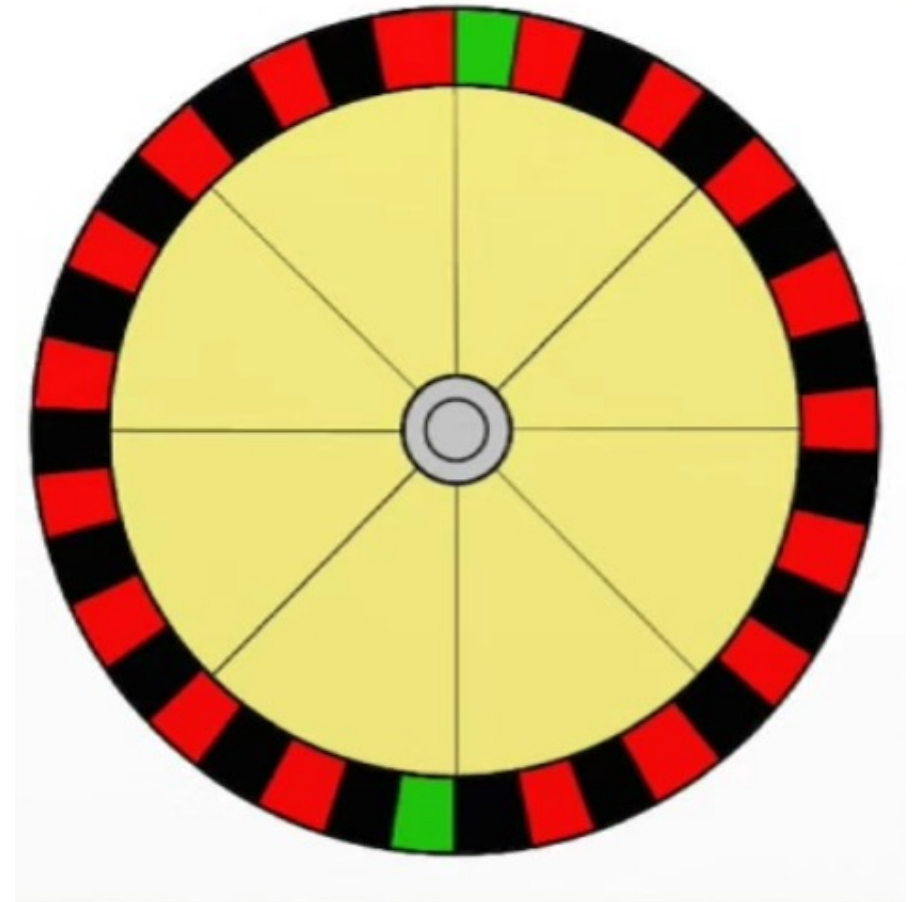
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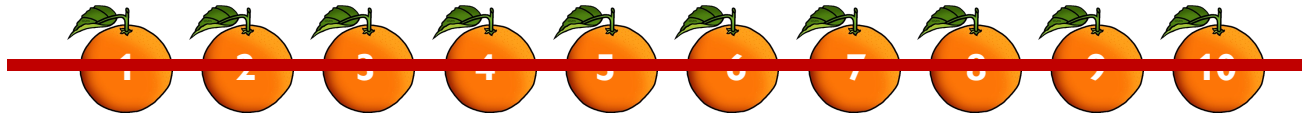
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 - Bet on black
$$P(\text{win}) = 18/38 \approx 0.474$$
 - Bet on green
$$P(\text{win}) = 2/38 \approx 0.05$$



Combinatorics review

COMBINATORICS: WHAT FOR?

- Combinatorics: the art of counting **without** enumerating.



- Computer science: determine time and space complexity of an algorithm.
- Counting number of elements in a set – basis for probability theory.



Fundamental counting principles

TWO FUNDAMENTAL RULES

Sum Rule

- If there are **a** ways of doing A and **b** ways of doing B **and we can not do both at the same time**, then there are **a + b** ways to choose one of the actions.

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$$|A \cup B| = |A| + |B|$$

$$\text{when } A \cap B = \emptyset$$

RULE OF SUM: EXAMPLE

- We want to order dinner for tonight:
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 $|P| = 3, |S| = 2, \quad |P \cup S| = |P| + |S| = 3 + 2 = 5$

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$$|A \times B| = |A| \cdot |B|$$

RULE OF PRODUCT: EXAMPLE

- You want to order pizza:
 - first, choose the type of crust:
thin or thick (2 choices);
 - second, choose one topping:
cheese, pepperoni, or sausage (3 choices).
- How many different pizzas are there?

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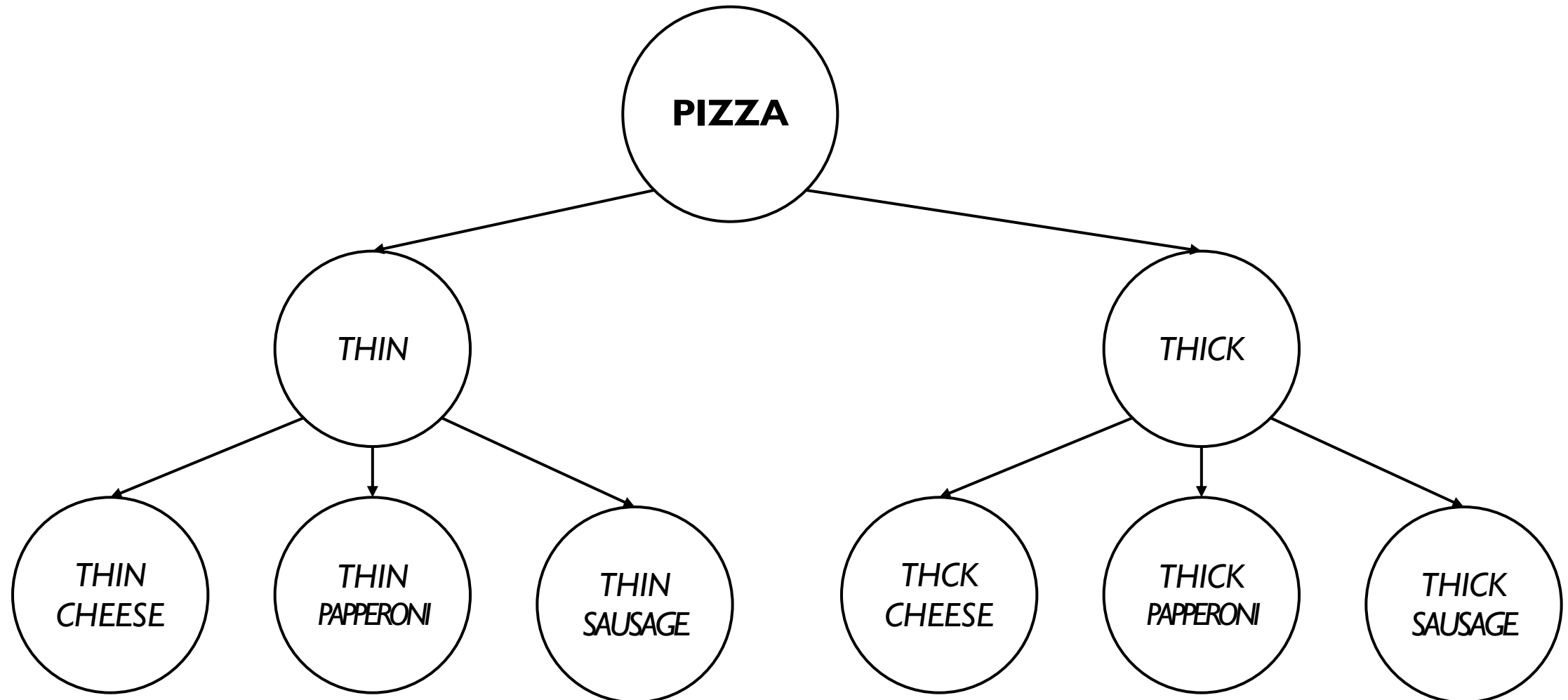
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$$|C \times T| = |C| \cdot |T| = 2 \cdot 3 = 6$$

EXAMPLE: NUMBER OF PASSWORDS

- A valid password contains 6 to 8 symbols
 - first symbol is a letter (upper- or lowercase);
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Sum rule:

$$N = P_6 + P_7 + P_8 \qquad P_i - \# \text{ passwords of length } i$$

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Sum rule: $N = P_6 + P_7 + P_8$ P_i – # passwords of length i

First symbol:

upper- or lowercase letter – $2 \cdot 26 = 52$ options

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First symbol:

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Other symbols:

upper- or lowercase letter or digit – $52 + 10 = 62$ options

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$$P_6 =$$

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Product rule: $P_6 =$ $P_7 =$ $P_8 =$

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Product rule: $P_6 = 52 \cdot 62^5$ $P_7 =$ $P_8 =$

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$$N = 52 \cdot 62^5 + 52 \cdot 62^6 + 52 \cdot 62^7$$

COUNT NUMBERS DIVISIBLE BY 3

- How many numbers between 1 and 100 are divisible by 3?

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Every 3rd number is divisible by 3: 3, 6, 9, ..., 93, 96, 99.

COUNT NUMBERS DIVISIBLE BY 3

- How many numbers between 1 and 100 are divisible by 3?

Every 3rd number is divisible by 3: 3, 6, 9, ..., 93, 96, 99.

Thus, there are $[100 / 3] = 33$ of them.

COUNT NUMBERS DIVISIBLE BY 5

- How many numbers between 1 and 100 are divisible by 5?

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Every 5th number is divisible by 5: 5, 10, 15, ..., 95, 95, 100.

COUNT NUMBERS DIVISIBLE BY 5

- How many numbers between 1 and 100 are divisible by 5?

Every 5th number is divisible by 5: 5, 10, 15, ..., 95, 95, 100.

Thus, there are $[100 / 5] = 20$ of them.

COUNT NUMBERS DIVISIBLE BY 3 & 5

- How many numbers between 1 and 100 are divisible by 3?
33
- How many numbers between 1 and 100 are divisible by 5?
20
- How many numbers between 1 and 100 are divisible by 3 or 5?

COUNT NUMBERS DIVISIBLE BY 3 & 5

- How many numbers between 1 and 100 are divisible by 3?

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- How many numbers between 1 and 100 are divisible by 5?

20

- How many numbers between 1 and 100 are divisible by 3 or 5?

Sum rule:

33 numbers divisible by 3 + 20 numbers divisible by 5 =
= 53 numbers divisible by 3 or 5.

COUNT NUMBERS DIVISIBLE BY 3 & 5

- How many numbers between 1 and 100 are divisible by 3?

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- How many numbers between 1 and 100 are divisible by 5?

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- How many numbers between 1 and 100 are divisible by 3 or 5?

Sum rule:

$$\begin{aligned} & \cancel{33 \text{ numbers divisible by 3} + 20 \text{ numbers divisible by 5} =} \\ & \quad \quad \quad \cancel{= 53 \text{ numbers divisible by 3 or 5.}} \end{aligned}$$

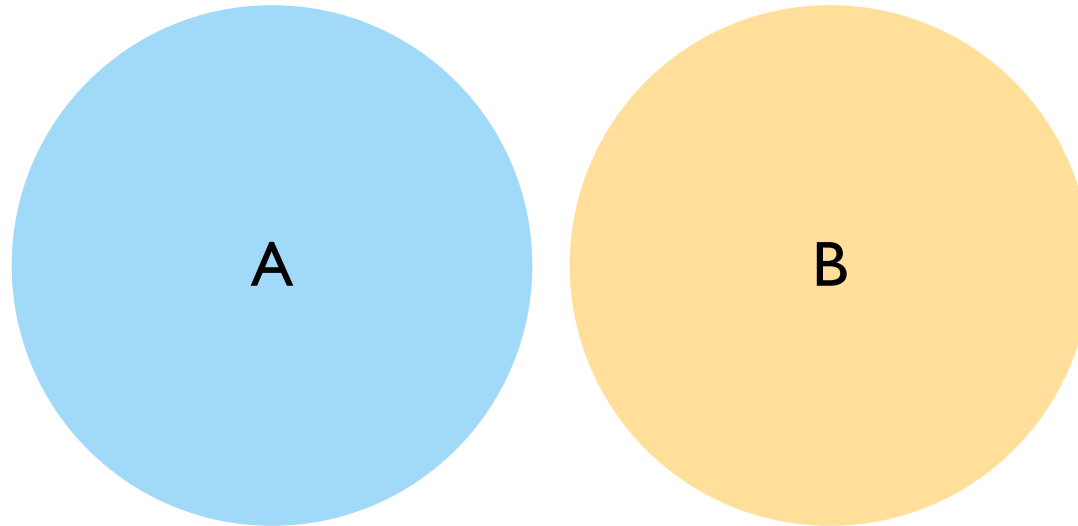
WRONG!

Exclusion-Inclusion Principle

ADDITION PRINCIPLE

- If A and B are disjoint sets ($A \cap B = \emptyset$), then

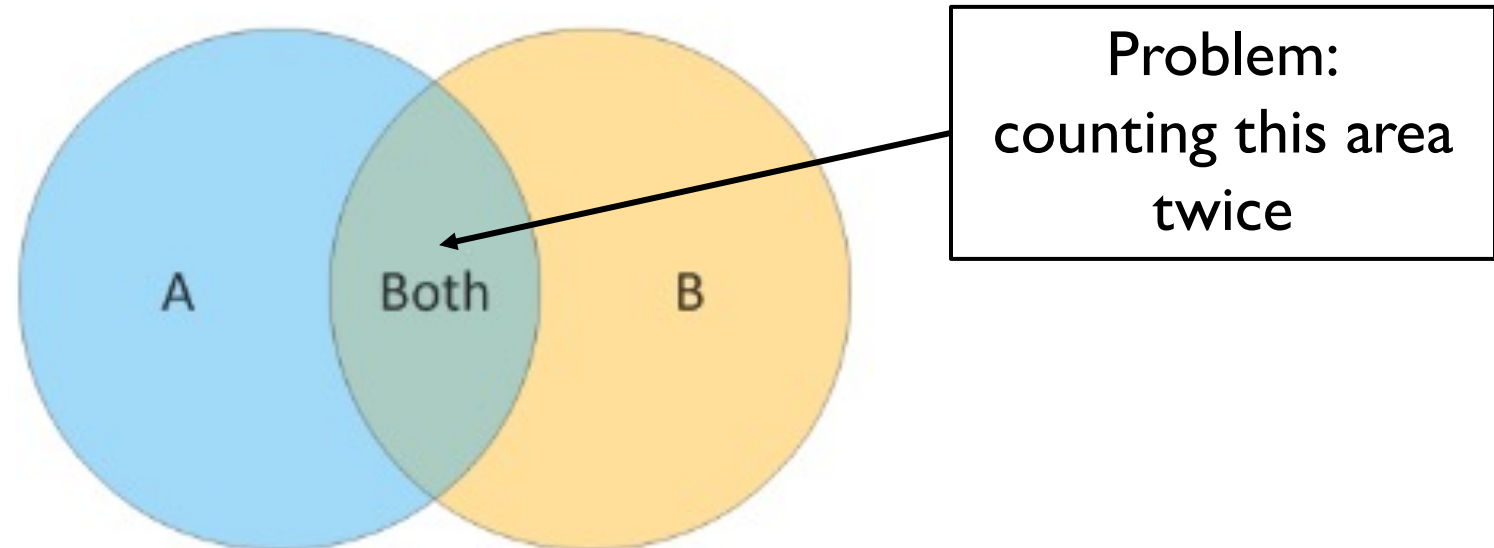
$$|A \cup B| = |A| + |B|$$



INCLUSION-EXCLUSION (2 SETS)

- If A and B are **not** disjoint ($A \cap B \neq \emptyset$), then

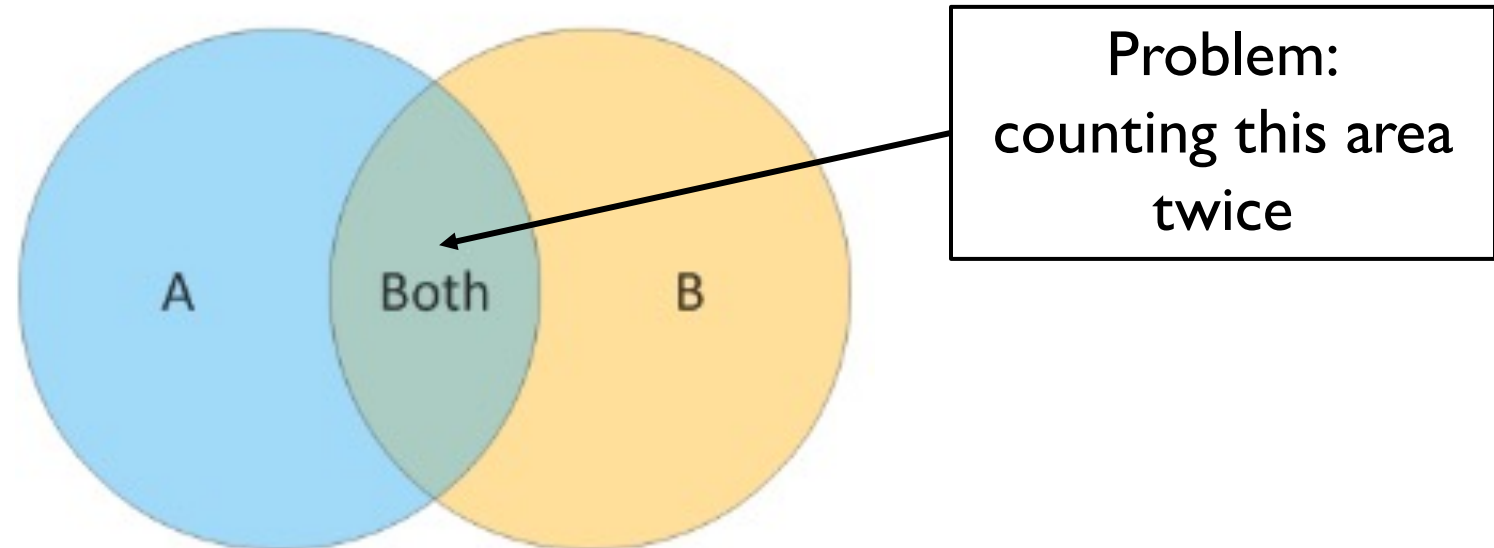
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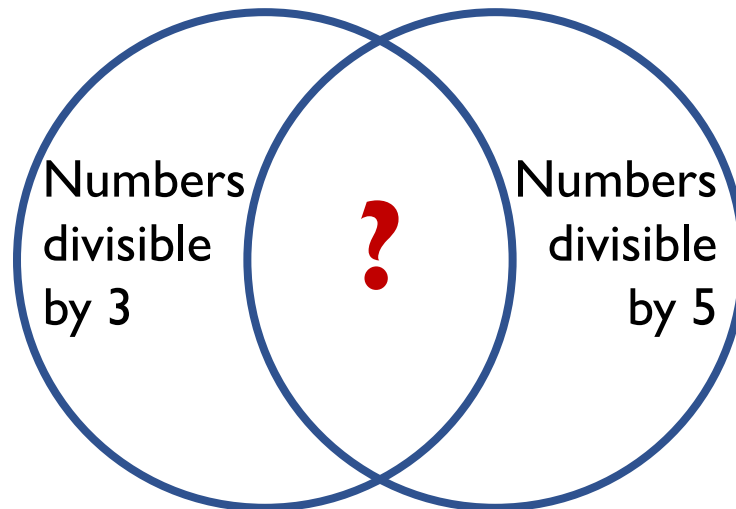
$$|A \cup B| = |A| + |B| - |A \cap B|$$



BACK TO OUR EXAMPLE

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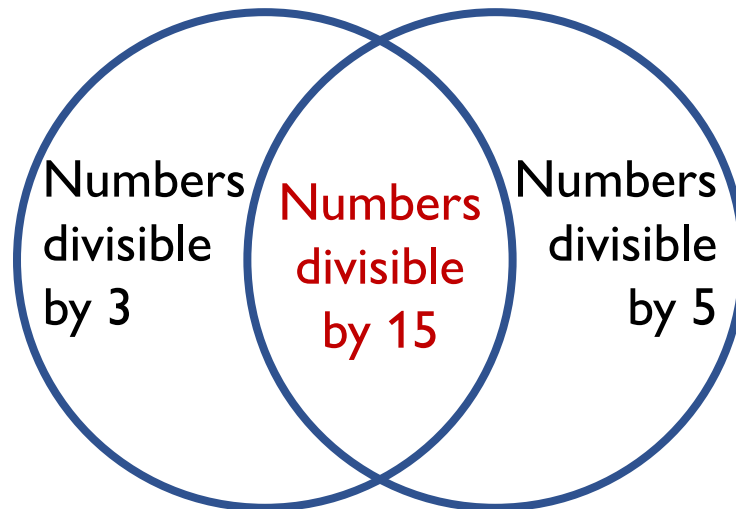
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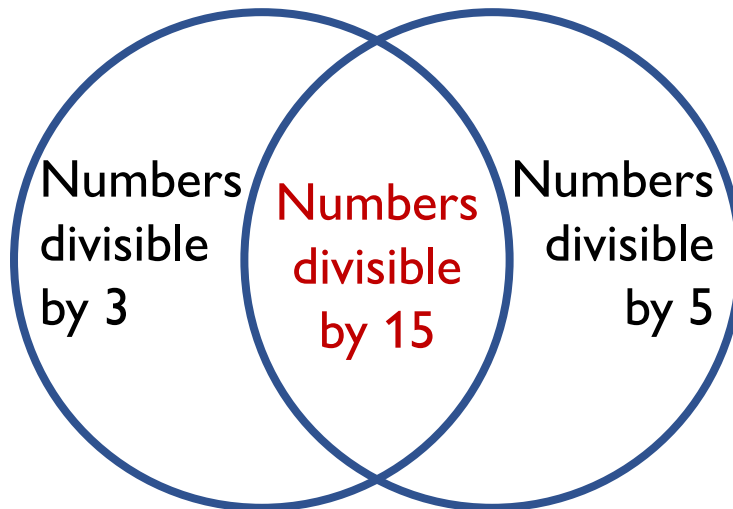
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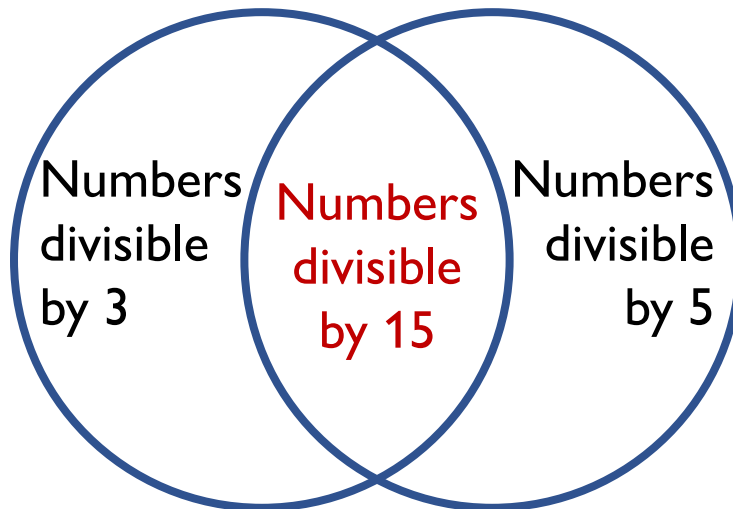
$$|D_3 \cup D_5| = |D_3| + |D_5| - |D_{15}| =$$



BACK TO OUR EXAMPLE

- How many numbers between 1 and 100 are divisible by 3 or 5?

$$\begin{aligned} |D_3 \cup D_5| &= |D_3| + |D_5| - |D_{15}| = \\ &= 33 + 20 - 6 = 47. \end{aligned}$$



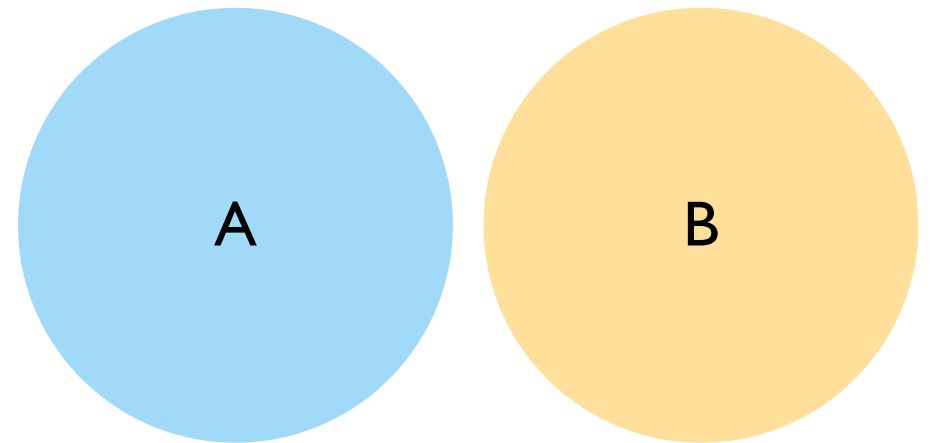
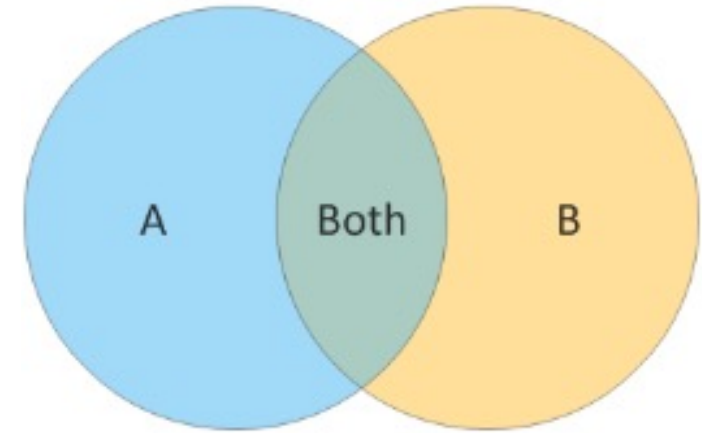
PRINCIPLE OF INCLUSION-EXCLUSION FOR TWO SETS

- For every two finite sets A and B

$$|A \cup B| = |A| + |B| - |A \cap B|.$$

- In particular, if A and B are disjoint, then $|A \cap B| = \emptyset$ and

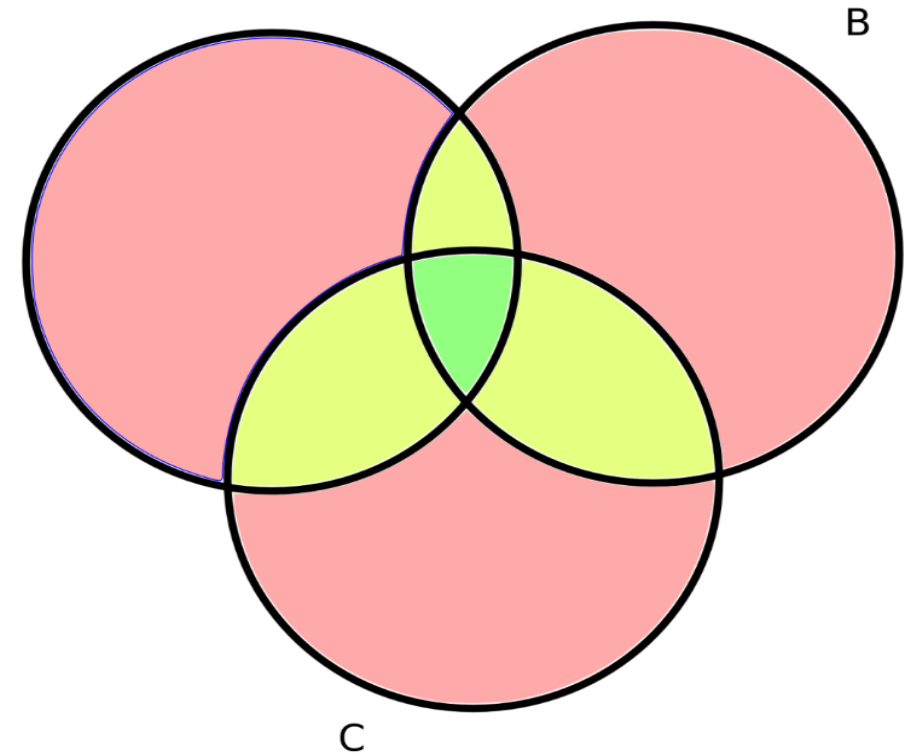
$$|A \cup B| = |A| + |B|.$$



PRINCIPLE OF INCLUSION-EXCLUSION FOR THREE SETS

- For any finite sets A, B and C

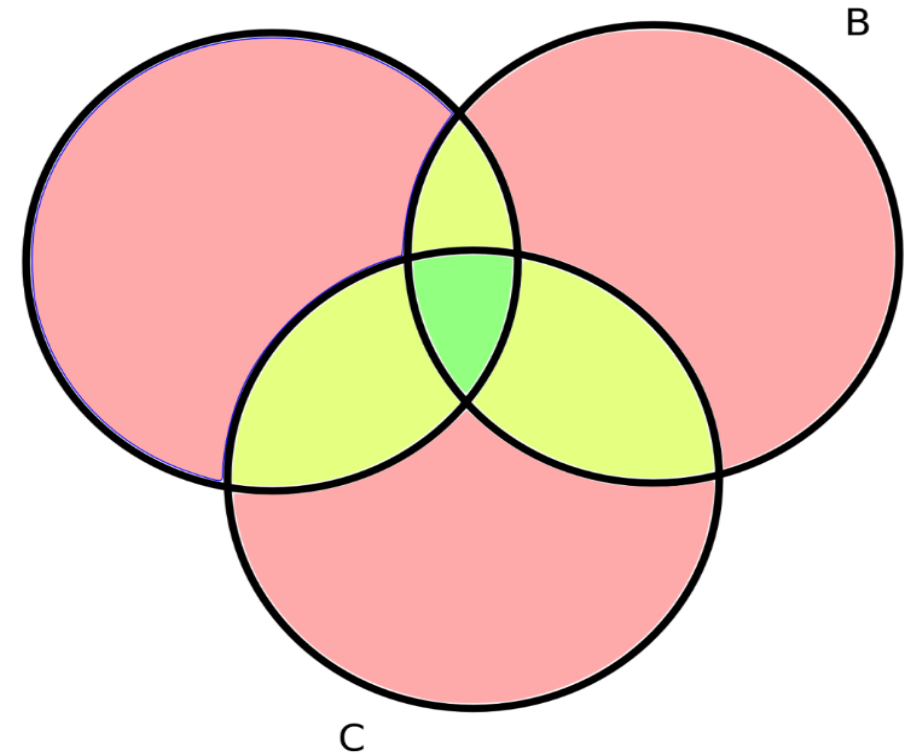
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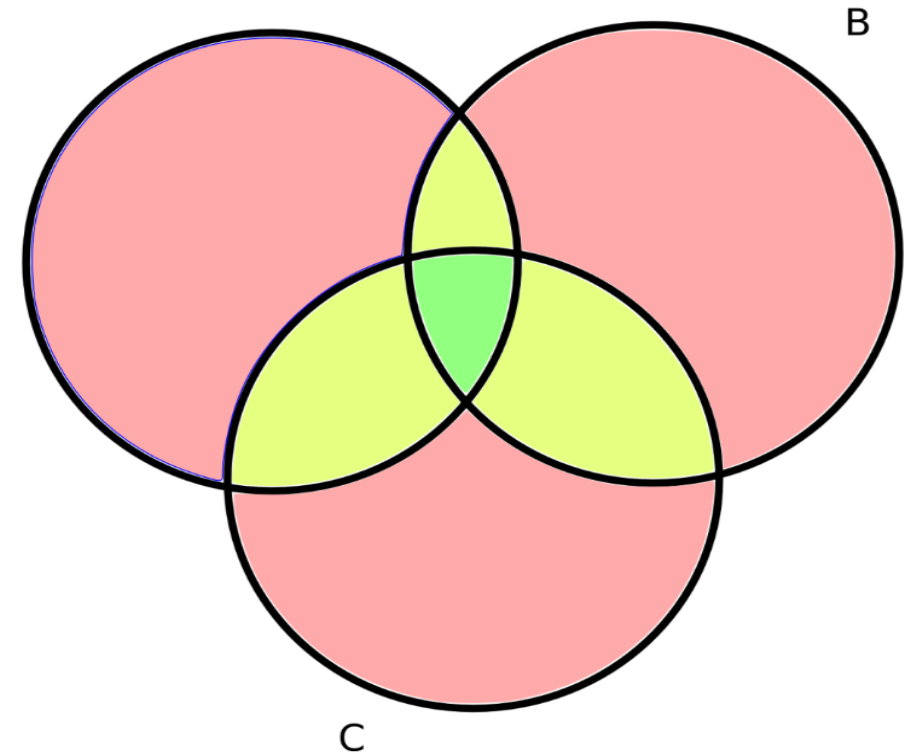
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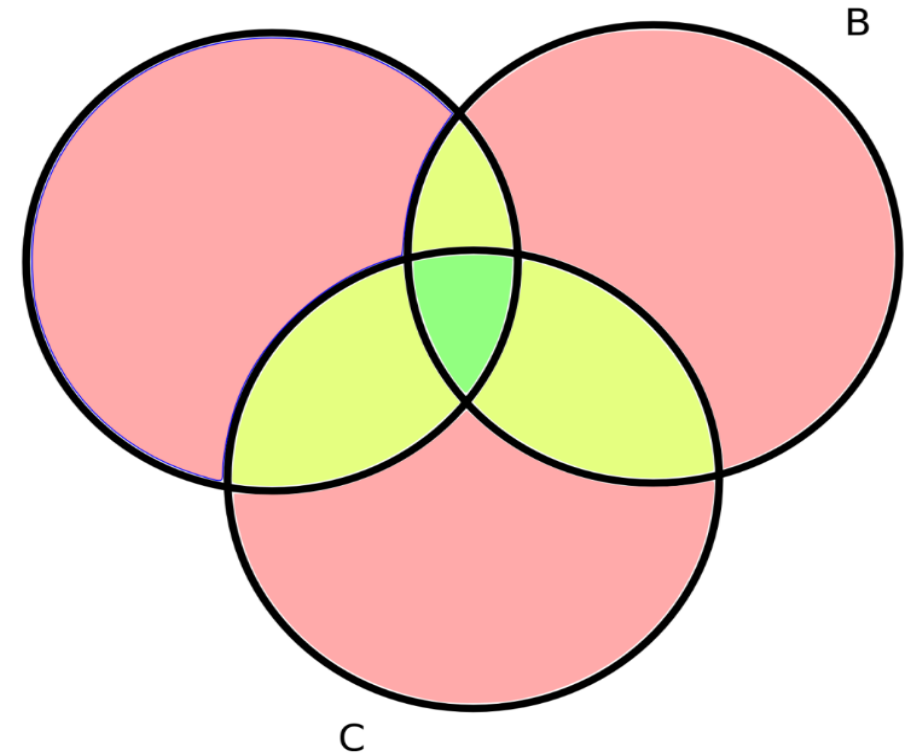
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Practice problems

Google classroom -> Day 1

STUDENTS AND COURSES

- A total of 36 students plan to take at least one of Discrete Mathematics, Algebra and Calculus during the coming semester:

Discrete Mathematics	23
Algebra	19
Calculus	18
Discrete Mathematics & Algebra	7
Discrete Mathematics & Calculus	9
Algebra & Calculus	11

How many students plan to take *all three* courses?

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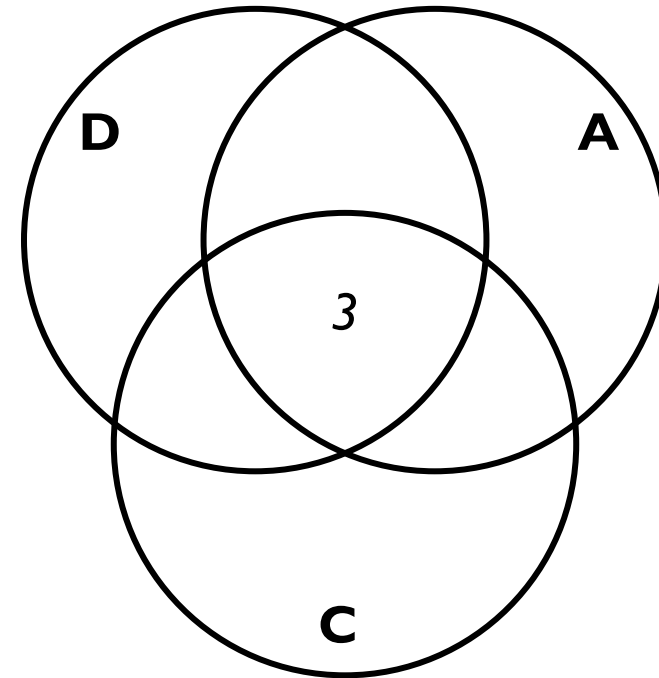
$$36 = 23 + 19 + 18 - 7 - 9 - 11 + N \qquad N = 3 \text{ students}$$

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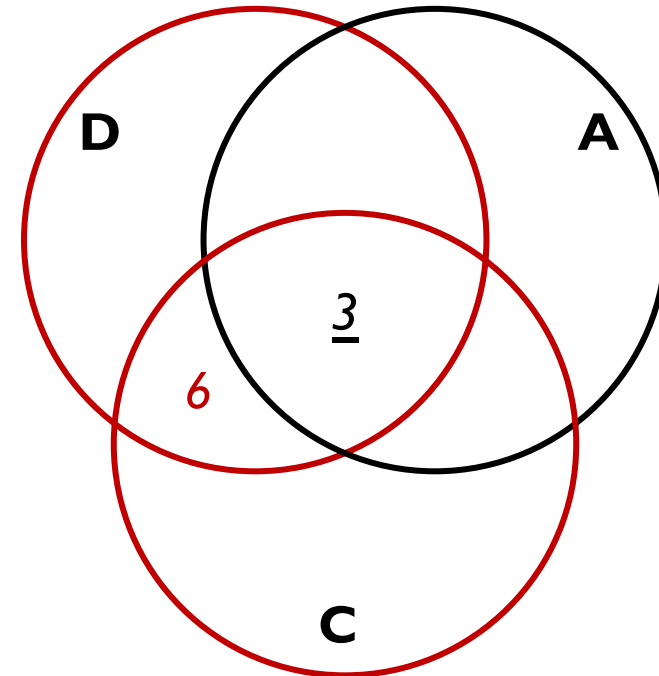


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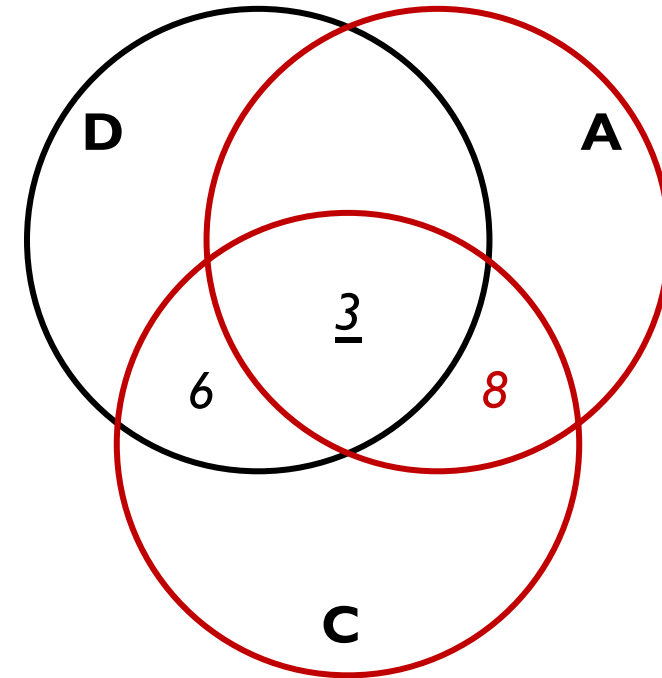


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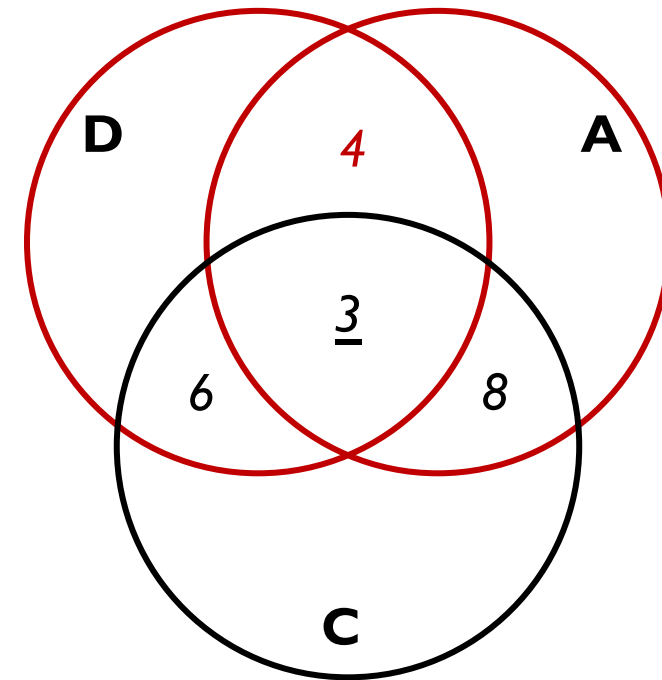


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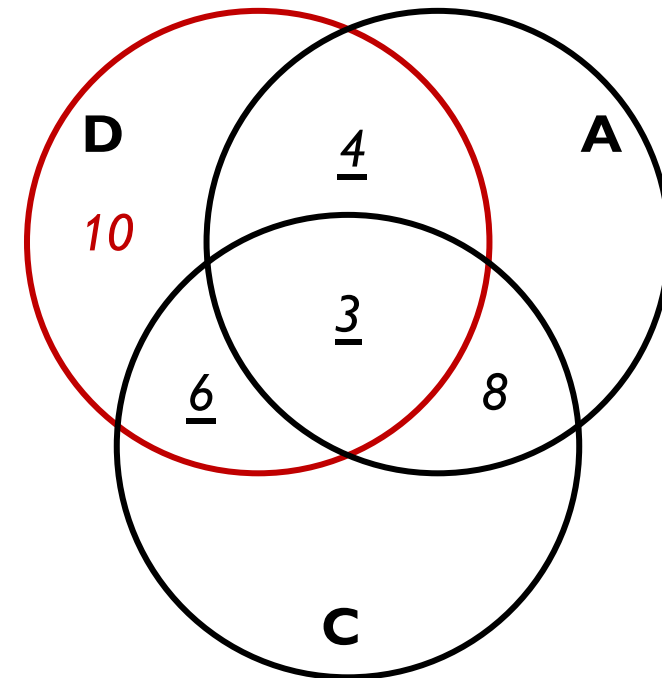


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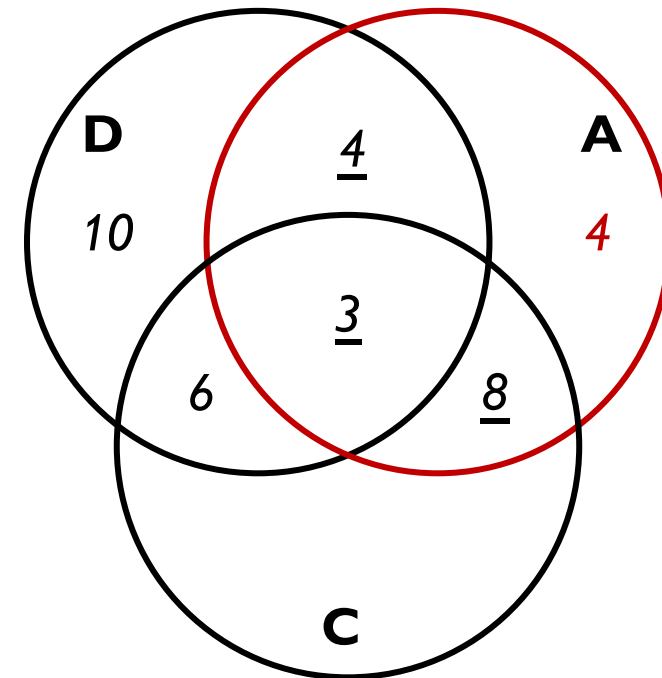


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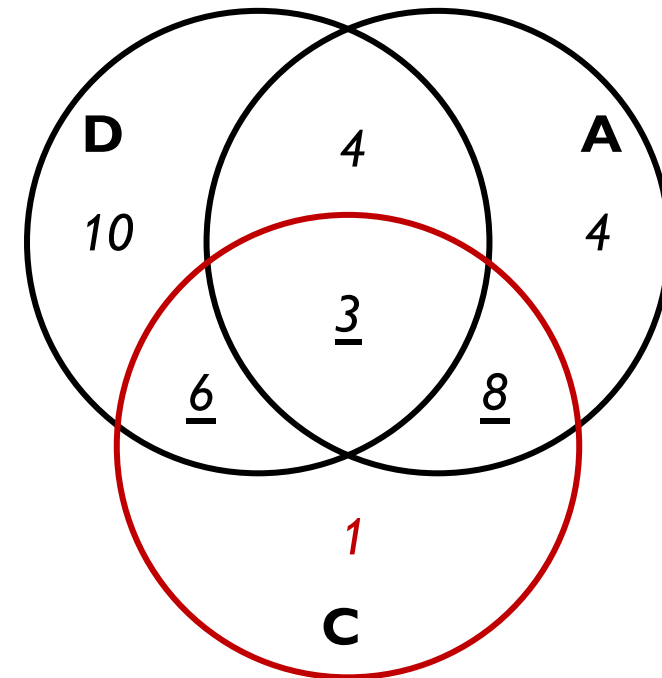


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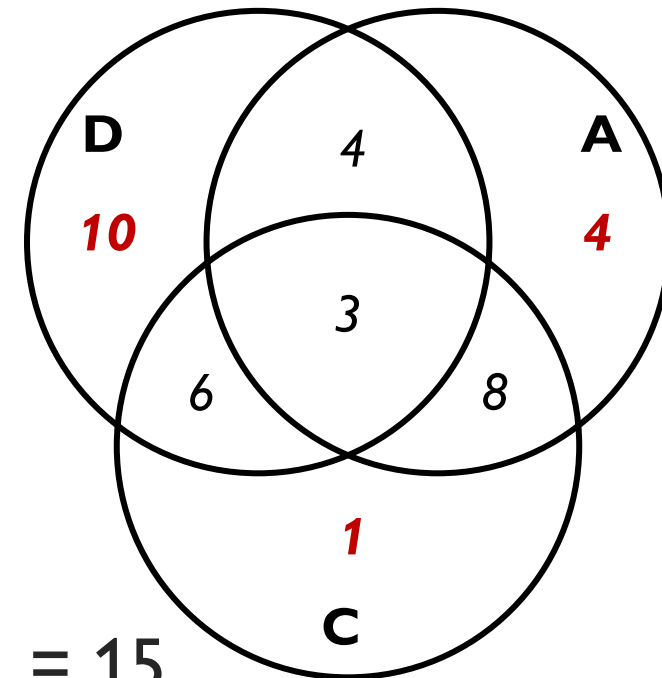
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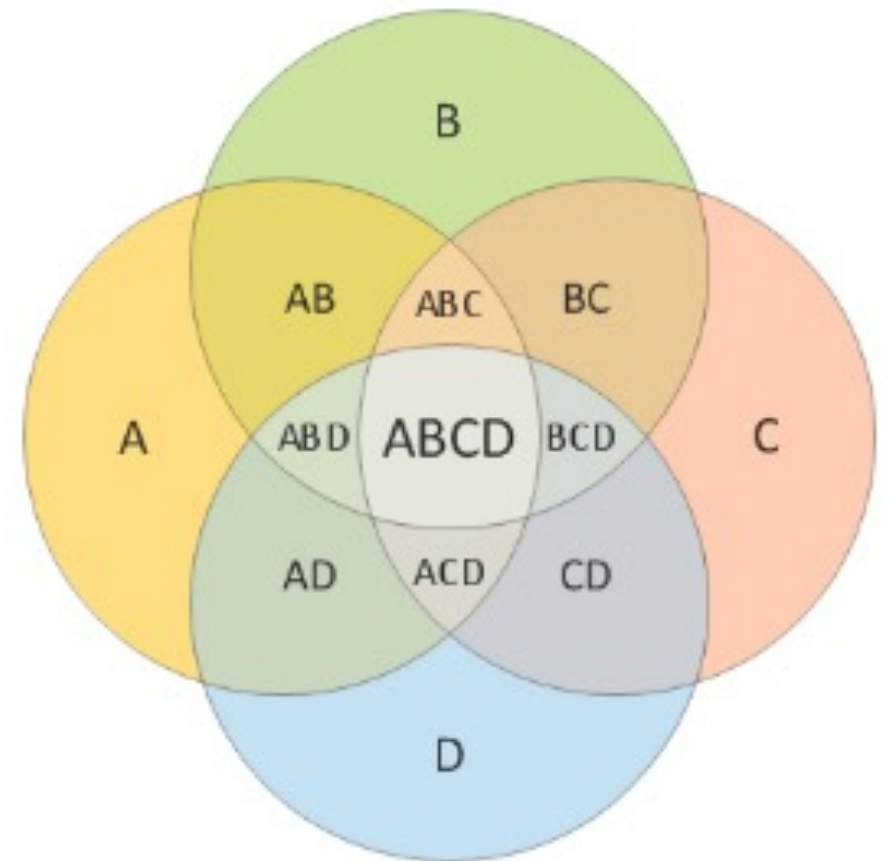


How many students plan to take *exactly one* of the courses? $10 + 4 + 1 = 15$

PRINCIPLE OF INCLUSION-EXCLUSION FOR FOUR SETS

For any finite sets A, B, C and D

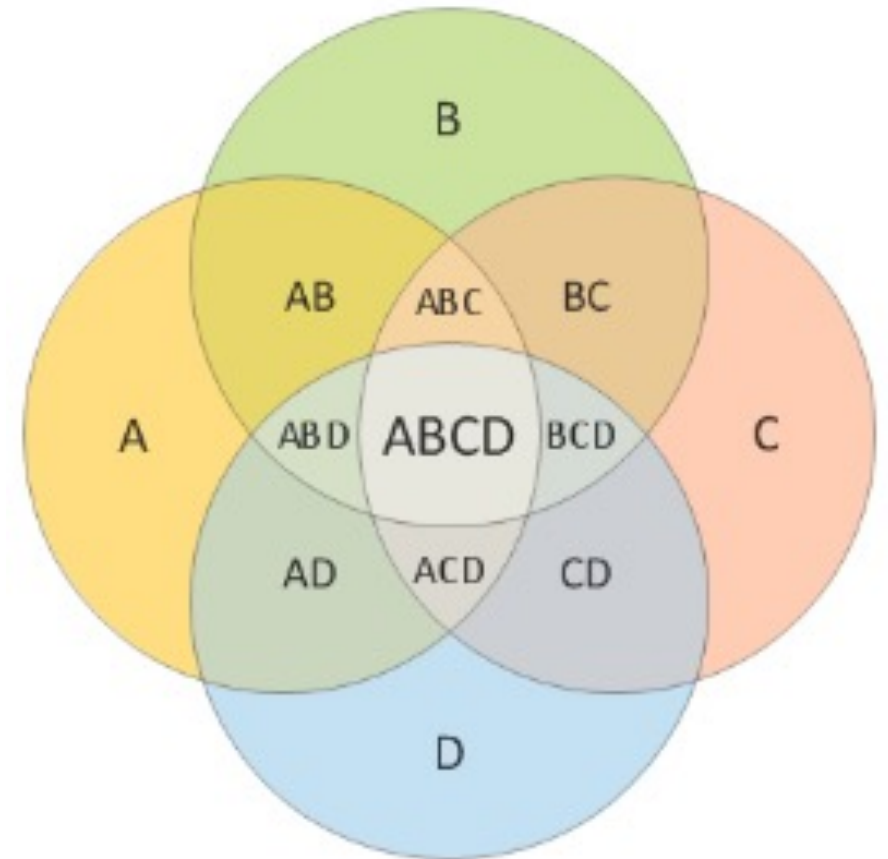
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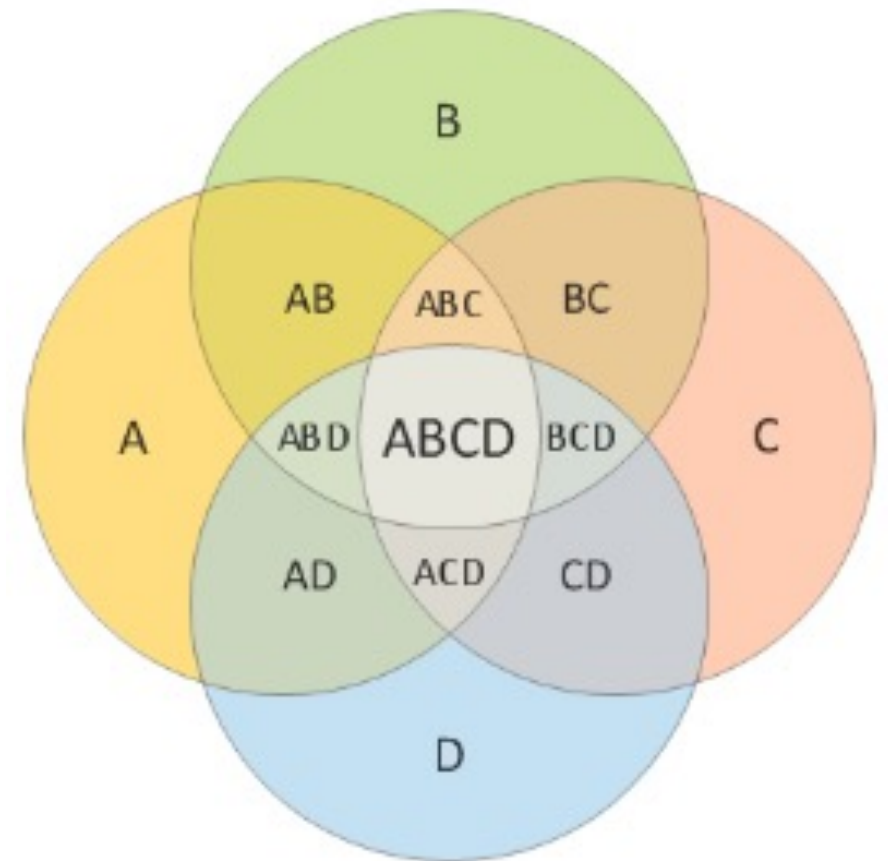
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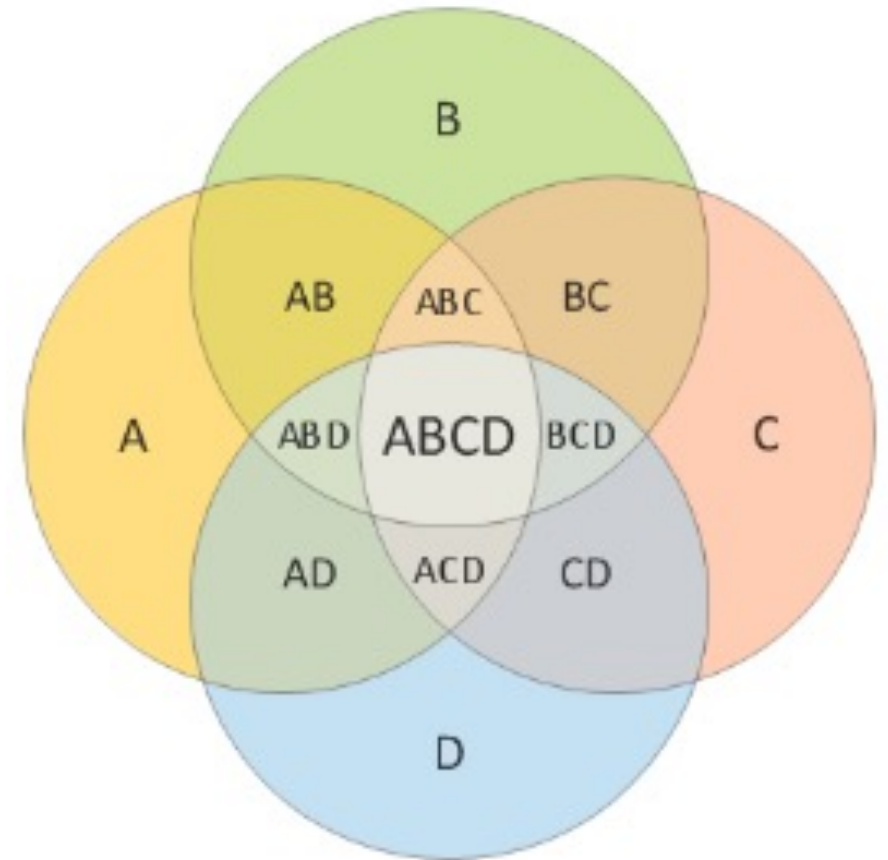
$$\begin{aligned} |A \cup B \cup C \cup D| &= \\ &= |A| + |B| + |C| + |D| - \\ &\quad - |A \cap B| - |A \cap C| - |A \cap D| - \\ &\quad - |B \cap C| - |B \cap D| - |C \cap D| \end{aligned}$$



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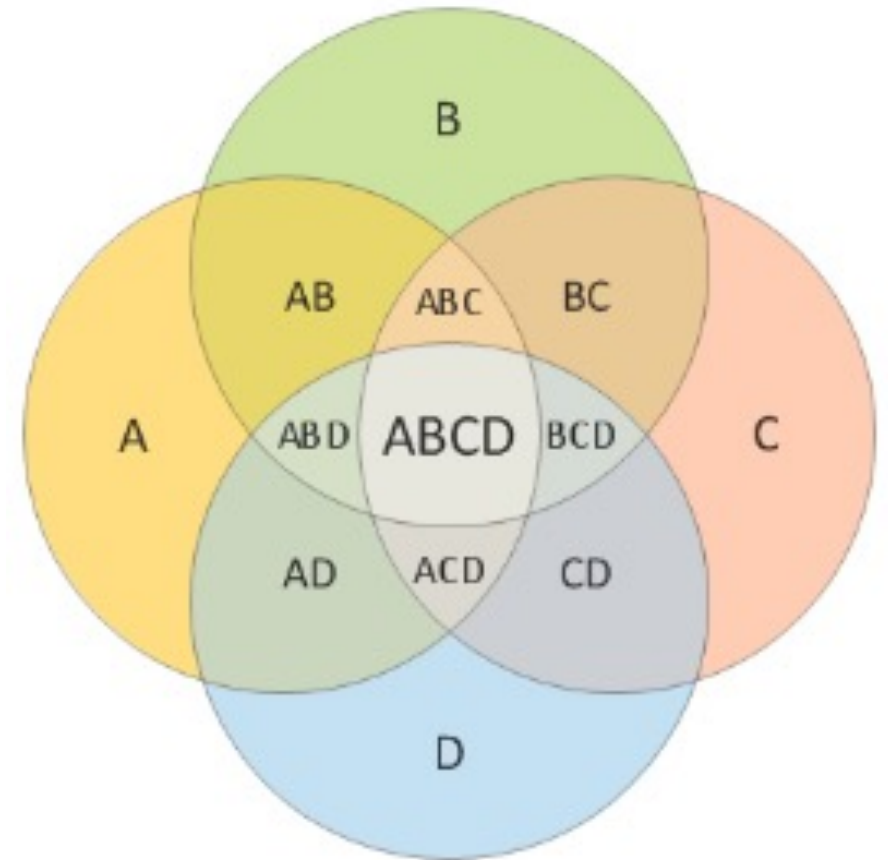
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PRINCIPLE OF INCLUSION-EXCLUSION FOR FOUR SETS

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Permutations and combinations

POSSIBLE ARRANGEMENTS

- In how many ways can n people sit in a row?
- How many words of length n strings are there?
- We have n different candies.
In how many ways can we chose $k \leq n$ out them?
- In how many ways can we distribute k identical candies among n kids?

POSSIBLE ARRANGEMENTS

	WITHOUT REPETITIONS	WITH REPETITIONS
ORDERED	In how many ways can n people sit in a row?	How many different n -bit strings are there?
NOT ORDERED	In how many ways can we chose k out of n different candies in a bag?	In how many ways can we distribute k identical candies among n kids?

POSSIBLE ARRANGEMENTS

	WITHOUT REPETITIONS	WITH REPETITIONS
ORDERED	<i>PERMUTATIONS</i> Seating n people in a row	<i>TUPLES</i> How many different n -bit strings are there?
NOT ORDERED	<i>COMBINATIONS</i> Choosing k out of n different candies in a bag	<i>COMBINATIONS with repetitions</i> Distributing k identical candies among n kids

Permutations

Ordered, each element can be used only once (no repetitions)

PERMUTATIONS OF n ELEMENTS

- In how many ways can n distinct objects be ordered?

Example:

In how many orders can we put 10 books on the shelf?

PERMUTATIONS OF n ELEMENTS

- In how many ways can n distinct objects be ordered?

Example:

In how many orders can we put n books on the shelf?

10 ·

PERMUTATIONS OF n ELEMENTS

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$$10 \cdot 9 \cdot$$

PERMUTATIONS OF n ELEMENTS

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$$10 \cdot 9 \cdot 8 \cdot \dots$$

PERMUTATIONS OF n ELEMENTS

- In how many ways can n distinct objects be ordered?

Example:

In how many orders can we put n books on the shelf?

$$10 \cdot 9 \cdot 8 \cdot \dots \cdot 3 \cdot 2 \cdot 1 = 10!$$

PERMUTATIONS OF n ELEMENTS

- In how many ways can n distinct objects be ordered? **Answer: $n!$**

Example:

In how many orders can we put n books on the shelf?

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REPEATED ELEMENTS

- How many arrangement of the letters in the word **SUCCESS** are there?

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only $\frac{7!}{2! \cdot 3!}$ different arrangements

REPEATED ELEMENTS

If among n elements $k \leq n$ elements are not unique, with n_1, n_2, \dots, n_k repetitions respectively, then the number of possible permutations is

$$\frac{n!}{n_1! \cdot n_2! \cdot \dots \cdot n_k!}$$

Tuples

Not ordered, each element can be used multiple times (repetitions are allowed)

NUMBER OF 6-BIT STRINGS

- Example of a 6-bit string:

0	1	1	1	0	1
---	---	---	---	---	---

- How many such strings are there?

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---	---	---	---	---	---

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Each position:

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Each position: 0 or 1 (2 choices)

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Product rule:

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- Solution:

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---	---	---	---	---	---

Each position: 0 or 1 (2 choices)

Product rule:

$$2 \cdot 2 \cdot 2 \cdot 2 \cdot 2 \cdot 2 = 2^6 = 64 \text{ different 6-bit strings.}$$

Combinations (without repetitions)

Not ordered, each element can be used only once (no repetitions)

COMBINATIONS

- How many committees of two people can be chosen from this group of four people:

Jones, Chan, Vello, Harris

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Chan, Jones	Jones, Harris	Harris, Vello	Vello, Chan
Chan, Harris	Jones, Vello	Harris, Chan	Vello, Jones
Chan, Vello	Jones, Chan	Harris, Jones	Vello, Harris.

COMBINATIONS

- How many committees of two people can be chosen from this group of four people:

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Chan, Jones	Jones, Harris	Harris, Vello	Vello, Chan
Chan, Harris	Jones, Vello	Harris, Chan	Vello, Jones
Chan, Vello	Jones, Chan	Harris, Jones	Vello, Harris.

- Since the roles are the same, many of these are the same...

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- Since the roles are the same, many of these are the same. How do we fix this?
- People in the committee are indistinguishable and can be re-ordered in $2!$ ways:

$$\frac{4!}{2!(4-2)!} \text{ different committees}$$

COMBINATIONS: GENERAL CASE

- Suppose we want to choose k elements from a set with n elements, in no specific order.

In other words: select a subset of size k from a set of size n .

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$$C(n, k) = \frac{n!}{k! (n - k)!}$$

NOTATION

$$C(n, k) = \binom{n}{k} = C_n^k = \frac{n!}{k! (n - k)!}$$

Combinations with repetitions

BOOKS

- In how many ways can we place 20 books on 5 bookshelves?
Each shelf can accommodate from 0 to 20 books.

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We need to assign shelves to the books

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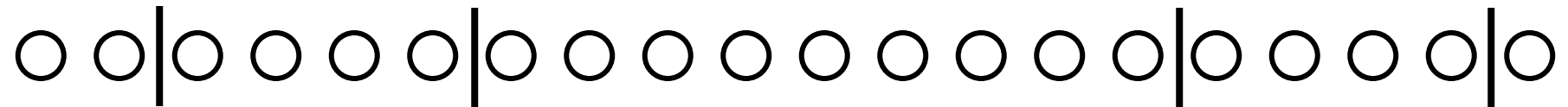
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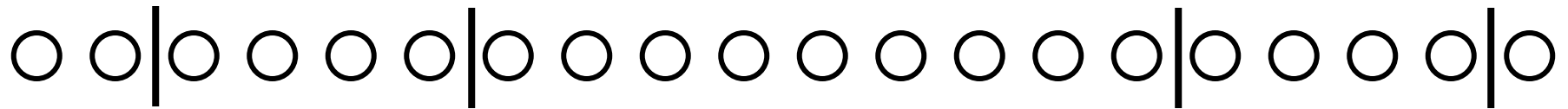
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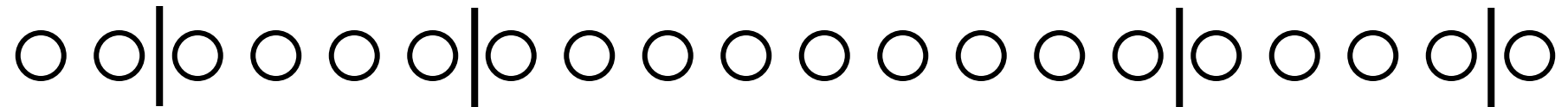


$$C(\quad n - 1) =$$

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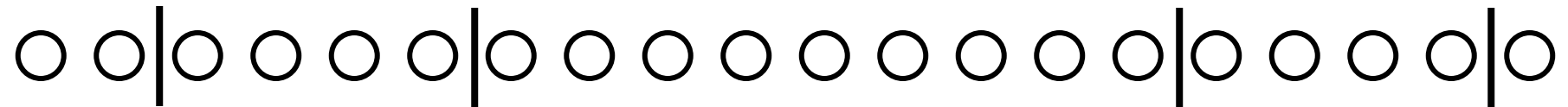


$$C(k + n - 1, n - 1) =$$

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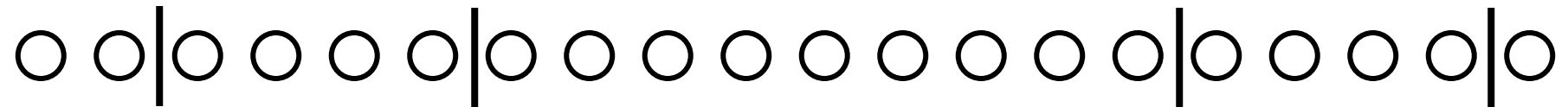


$$C(k + n - 1, n - 1) = C(24, 4) =$$

BOOKS

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Each shelf can accommodate from 0 to 20 books.
- $n = 5$ bookshelves
- $k = 20$ books

We need to assign shelves to the books



$$C(k + n - 1, n - 1) = C(24, 4) = \frac{24!}{4!20!} = 10626$$

To sum up

POSSIBLE ARRANGEMENTS

	WITHOUT REPETITIONS	WITH REPETITIONS
ORDERED	<p><i>PERMUTATIONS</i></p> <p>Seating n people in a row</p> <p>$n!$</p>	<p><i>TUPLES</i></p> <p>Counting different n-bit strings are there?</p> <p>k^n</p>
NOT ORDERED	<p><i>COMBINATIONS</i></p> <p>Choosing k out of n different candies in a bag</p> <p>$C(n, k) = \frac{n!}{k! (n - k)!}$</p>	<p><i>COMBINATIONS with repetitions</i></p> <p>Distributing k identical candies among n kids</p> <p>$C(k + n - 1, n - 1)$</p>

Practice problems

Google classroom -> Day 1

STRINGS

- Each entry of a string is an element of the set $S = \{0, 1, 2\}$. How many such strings of length 6 are there that begin with 022 or end with 01?

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Inclusion-exclusion

strings beginning with 022:

string ending with 01:

strings beginning with 002 and ending with 01:

STRINGS

- Each entry of a string is an element of the set $S = \{0, 1, 2\}$. How many such strings of length 6 are there that begin with 022 or end with 01?

Inclusion-exclusion

strings beginning with 022: $3^3 = 27$

string ending with 01:

strings beginning with 002 and ending with 01:

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Inclusion-exclusion

strings beginning with 022: $3^3 = 27$

string ending with 01: $3^4 = 81$

strings beginning with 002 and ending with 01:

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strings beginning with 002 and ending with 01: 3

STRINGS

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Inclusion-exclusion

strings beginning with 022: $3^3 = 27$

string ending with 01: $3^4 = 81$

strings beginning with 002 and ending with 01: 3

$$27 + 81 - 3 = 105$$

sequences that start with 002 or end with 01

NUMBER OF SUBSETS OF A SET

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- 2 options per each of the n element (*just like bit-strings!*).

Product rule: $2 \cdot 2 \cdot \dots \cdot 2 = 2^n$ subsets