



Did you bring your notepad?

206 Discrete Structures II

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Remember

An iceberg floating in the ocean. The visible tip is a small, jagged mountain of white ice against a blue sky with scattered clouds. The submerged portion is a much larger, dark blue, and highly textured mass of ice, illustrating the concept of hidden knowledge or discovery.

What we cover in lectures

*What you
need to
discover*

Reading for Quiz 1 (and beyond...)

Lecture 2	Recap and Basics of Counting	Chapters 1, 2 and 5 of Rosen
Lecture 3	Basics of Counting	Chapters 1, 2 and 5 of Rosen Chapter 15 of Lehman
Lecture 4	Basics of Counting	Chapters 6 of Rosen Chapter 15 of Lehman

Quiz 1 – Monday October 2 & Wednesday October 4

What we will cover today

- Recap
 - Sets - Set Operations – Venn Diagram
- Combinatorics Intro (Recap 205)
 - Functions
 - Proofs
 - Induction

Combinatorics

- The study of arrangements of objects
- Studied as long ago as the 17th century, when combinatorial questions arose in the study of gambling games
- Used to solve many different types of problems
 - Examples:
Enumeration, the **counting of objects *with certain properties***
 - 1. Counting determines the complexity of algorithms
 - 2. Counting determines whether there are enough resources to solve a problem
 - 3. ...



Combinatorics

Used to solve many different types of problems

Enumeration, the **counting of objects** *with certain properties*

Example:

1. Counting determines the **complexity** of algorithms
2. Counting determines whether there are enough **resources** to solve a problem.

- Study of discrete structures
 - Counting structures of a given kind/size

```
function TARJAN(Node* node)
  node.visited ← true
  node.index ← indexCounter
  s.push(node)
  for all successor in node.successors do
    if !node.visited then TARJAN(successor)
    end if
    node.lowlink ← MIN(node.lowlink, successor.lowlink)
  end for
  if node.lowlink == node.index then
    repeat
      successor ← stack.pop()
    until successor == node
  end if
end function
```

What questions can
you ask?

Combinatorics

Used to solve many different types of problems

Enumeration, the **counting of objects** *with certain properties*

Example:

1. Counting determines the **complexity** of algorithms
2. Counting determines whether there are enough **resources** to solve a problem.

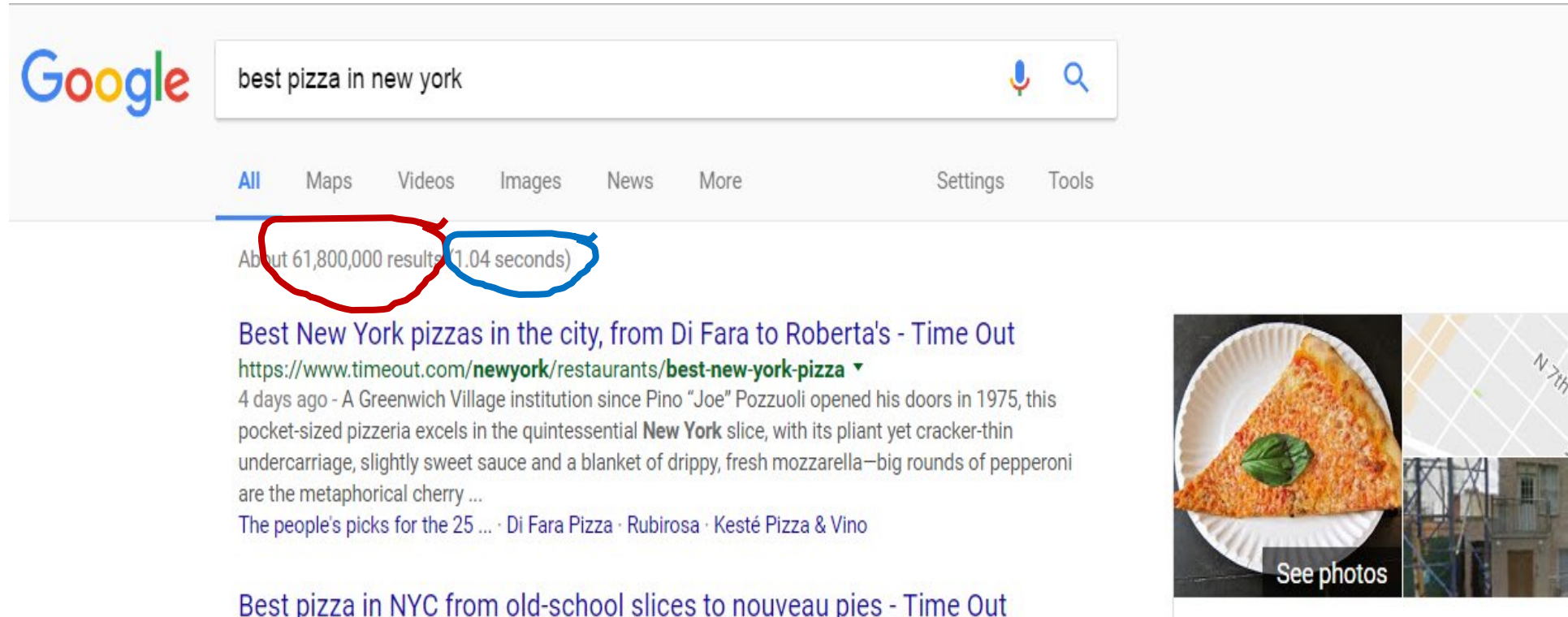
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end function
```

Complexity:
What is the runtime?

Resources:
What is the memory usage?

Combinatorics – Enumerating Example



The image is a screenshot of a Google search results page for the query "best pizza in new york". The Google logo is on the left, and the search bar contains the text "best pizza in new york". Below the search bar, there are tabs for "All", "Maps", "Videos", "Images", "News", and "More". The "All" tab is selected. Below the tabs, the search results are displayed. The first result is titled "Best New York pizzas in the city, from Di Fara to Roberta's - Time Out" with a URL "https://www.timeout.com/newyork/restaurants/best-new-york-pizza". The text of the result describes a Greenwich Village institution since 1975. To the right of the text, there are two images: a slice of pizza on a white plate and a map of New York City. A red circle highlights the text "About 61,800,000 results" and a blue circle highlights the text "(1.04 seconds)".

Google

best pizza in new york

All Maps Videos Images News More Settings Tools

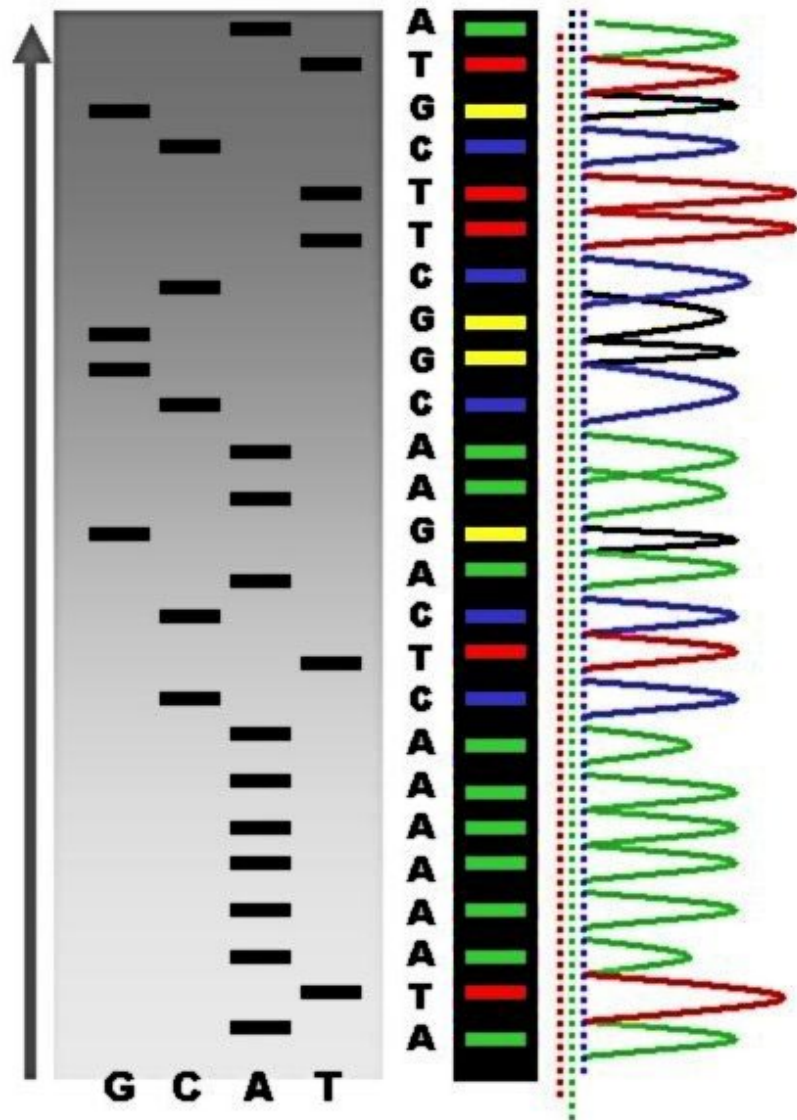
About 61,800,000 results (1.04 seconds)

Best New York pizzas in the city, from Di Fara to Roberta's - Time Out
<https://www.timeout.com/newyork/restaurants/best-new-york-pizza> ▾
4 days ago - A Greenwich Village institution since Pino "Joe" Pozzuoli opened his doors in 1975, this pocket-sized pizzeria excels in the quintessential **New York** slice, with its pliant yet cracker-thin undercarriage, slightly sweet sauce and a blanket of drippy, fresh mozzarella—big rounds of pepperoni are the metaphorical cherry ...
The people's picks for the 25 ... · Di Fara Pizza · Rubirosa · Kesté Pizza & Vino

Best pizza in NYC from old-school slices to nouveau pies - Time Out

See photos

Combinatorics



Recently, it has played a key role in
mathematical biology,
e.g., in sequencing DNA.

Combinatorics

- We will study the **basic rules of counting**
 - They can solve a tremendous variety of problems, such as:
 - Enumerate the **different telephone numbers** possible in the United States,
 - Enumerate the **allowable passwords** on a computer system,
 - Enumerate the different orders in which the runners in a race can finish
 - They can help us answer questions that seem hard: *What is the chance that among the 240 students in this class, we find 2 with the same birthday?*
- An important **combinatorial tool** is the **pigeonhole principle**: When objects are placed in boxes and there are more objects than boxes, then there is a box containing at least 2 objects.
 - E.g., we can use this principle to show that among a set of 15 or more students, at least 3 were born on the same day of the week



Combinatorics

Your Password:

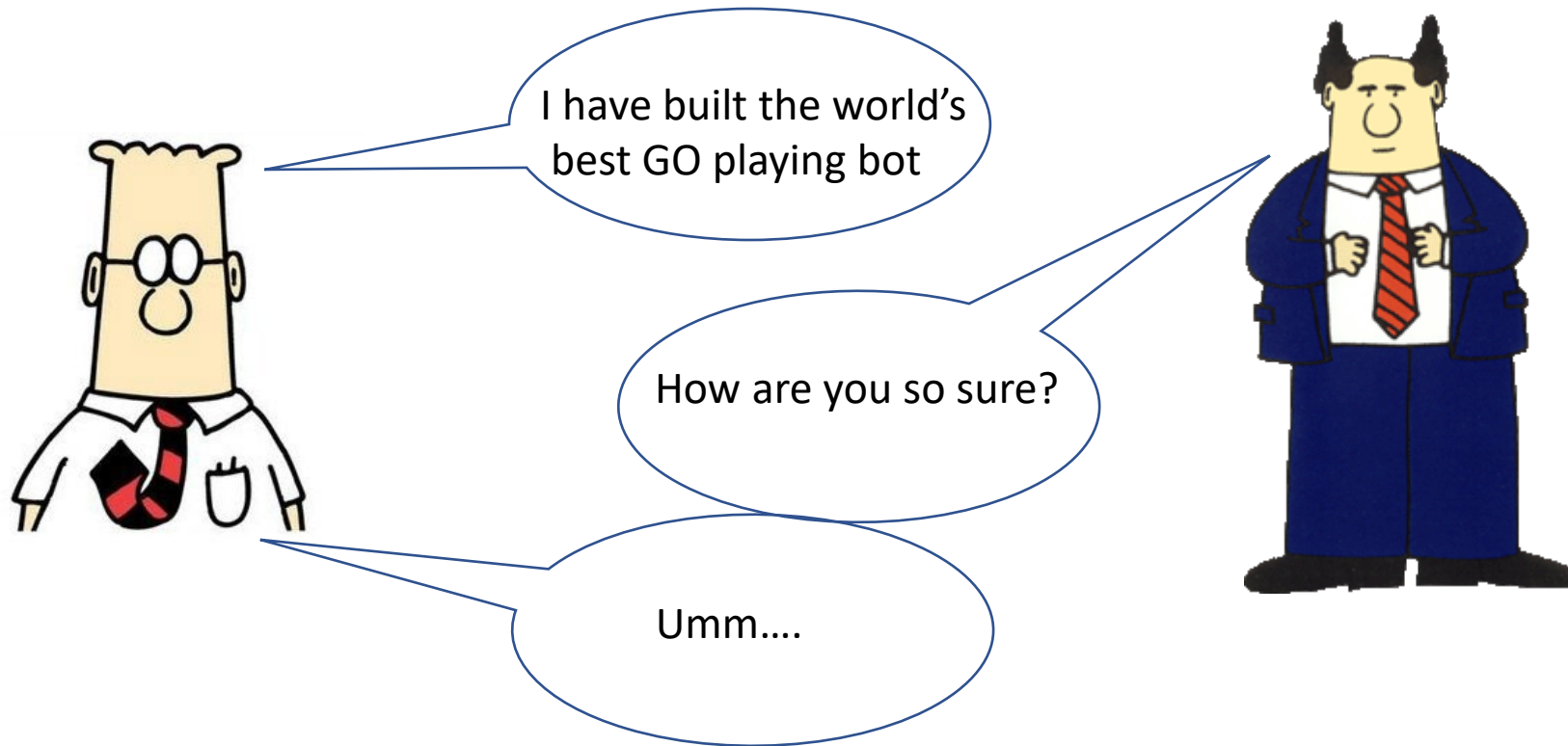
- Must be different from your User ID
- Must contain 8 to 20 characters, including one letter and number
- May include one of the following characters: %, &, _, ?, #, =, -
- Your new password cannot have any spaces and will not be case sensitive.

*REQUIRED FIELD

How many different passwords we can create?

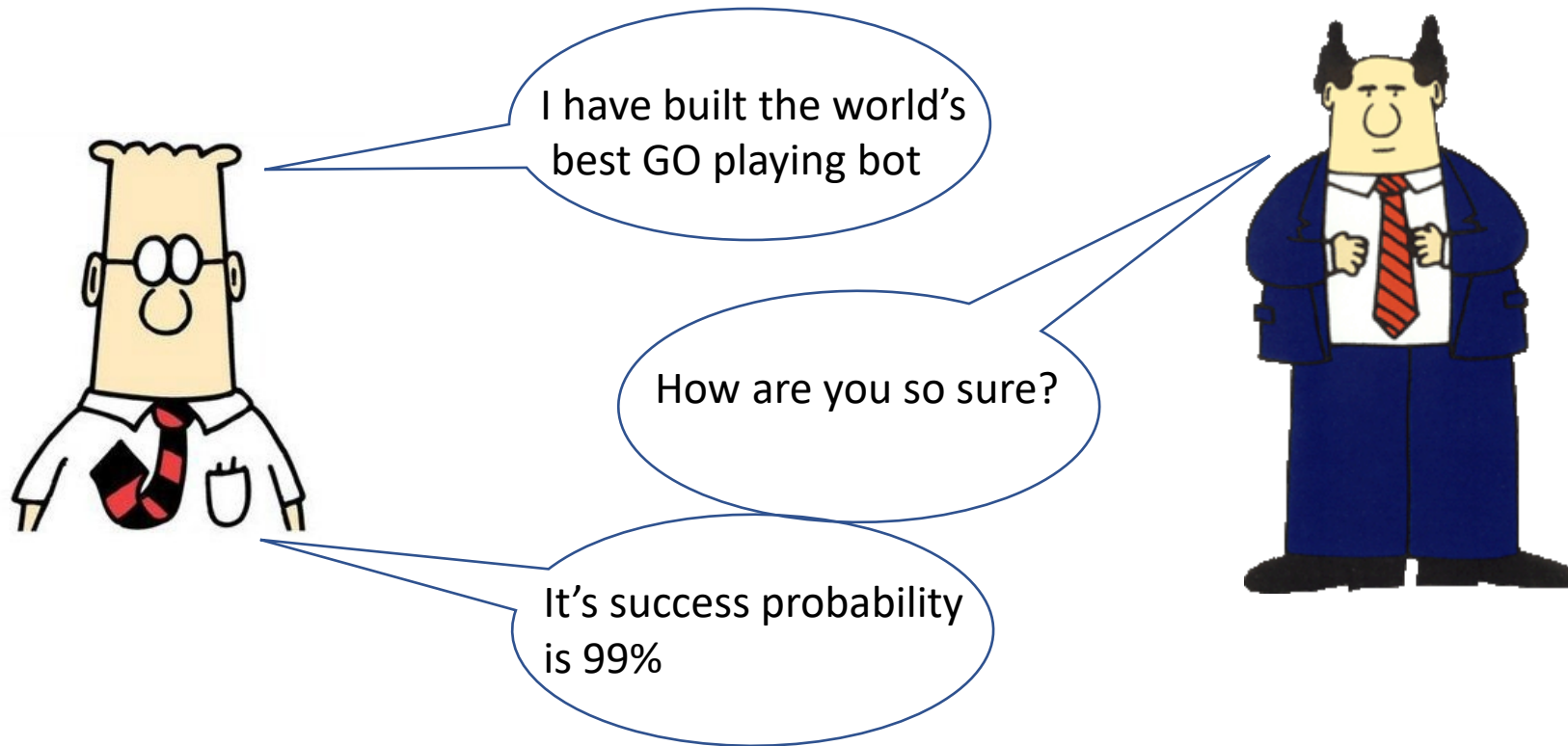
Combinatorics -> Probability Theory

- Analysis of uncertain or random phenomena



Probability Theory

- Analysis of uncertain or random phenomena



Probability Theory

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Probability Theory

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Course Outline

- Part I
 - Recap of basics – sets, function, proofs, induction
 - Basic counting techniques
 - Pigeonhole principle
 - Generating functions
- Part II
 - Sample spaces and events
 - Basics of probability
 - Independence, conditional probability
 - Random variables, expectation, variance
 - Moment generating functions
- Part III
 - Graph Theory
 - Machine learning and statistical inference

Sets

- What is a *Set*?
 - A collection of objects which are called *elements*
 - Elements are objects that share the same property
- Examples
 - My followers on Twitter
 - The set of webpages for a given Google query
 - Collection of YouTube videos

Sets

- The order of elements is not significant, so $\{x, y\}$ and $\{y, x\}$ are the same set written two different ways.
- And what about $y = x$?
 - $\{x, x\} = \{x\}$
- The expression $e \in S$ asserts that e **is an element of** set S
 - E.g., $32 \in S$ or $blue \notin S$

Sets – Common Sets

- What is a *Set*?
 - A collection of objects which are called *elements*.
- Some common sets in Math

• \emptyset	Empty set	$\{\}$
• \mathbb{N}	Nonnegative integers	$\{0,1,2,3,\dots\}$
• \mathbb{Z}	Integers	$\{\dots,-2,-1,0,1,2,\dots\}$
• \mathbb{Q}	Rational numbers	$\{1/2, 16, -5/2\}$
• \mathbb{R}	Real numbers	$\{\pi, e, -9, \sqrt{2}\}$
• \mathbb{C}	Complex numbers	$\{i, 19/2, \sqrt{2}-2i\}$

curly braces

A superscript “+” restricts a set to its positive elements; for example, \mathbb{R}^+ denotes the set of positive real numbers. Similarly, \mathbb{Z}^- denotes the set of negative integers

Sets - Set Operations

Example

$$X ::= \{1, 2, 3\}$$

$$Y ::= \{2, 3, 4\}$$

- Union: $X \cup Y$
 - All elements present in X or Y or both.
- Intersection: $X \cap Y$
 - All elements present in *both* X and Y .
- Difference: $X \setminus Y$
 - All elements present in X but not in Y .
 - *Not symmetric!*
- Product: $X \times Y$
 - Collection of all tuples (a, b) where $a \in X$ and $b \in Y$.
- Size: $|X|$
 - Number of elements in X .

$$X \cup Y = \{1, 2, 3, 4\}$$

$$X \cap Y = \{2, 3\}$$

$$X \setminus Y = \{1\}$$

$$Y \setminus X = \{4\}$$

$$X \times Y = \{(1, 2), (1, 3), (1, 4), (2, 2), (2, 3), (2, 4), (3, 2), (3, 3), (3, 4)\}$$

$$|X| = 3$$

$$|Y| = 3$$

Sets - Set Comparisons

- Subset: $X \subset Y$
 - Every element present in X is also present in Y .
 - X is **not** the same as Y .
- Superset: $X \supset Y$
 - Every element present in Y is also present in X .
 - X is **not** the same as Y .
- Note: There is a direct analogy between [**\subset and $<$**] and [**\subseteq and \leq**]

$$X = \{1\}, Y = \{1, 2, 3\}$$
$$X \subset Y$$

Power Set

$$X = \{1, 2, 3\}$$

$$\text{power}(X) = \{\emptyset, \{1\}, \{2\}, \{3\}, \{1, 2\}, \{1, 3\}, \{2, 3\}, \{1, 2, 3\}\}$$

- Let X be a set.
- $\text{Power}(X)$ = set of all subsets of X
- E.g., $\text{Power}(\{1, 2\}) = \{1\}, \{2\}, \text{and } \{1, 2\}$
- Is this correct?
 - NO!
 - $\text{Power}(\{1, 2\}) = \{1\}, \{2\}, \{1, 2\}, \text{and } \{\}$
- Generally, if A has n elements, then there are 2^n sets in $\text{Power}(A)$

Set Builder Notation

- Often sets cannot be fully described by listing the elements explicitly or by taking unions, intersections, etc., of easily-described sets
- **Set builder notation** often comes to the rescue
- The idea is to define a set using a **predicate**; in particular, the set consists of all values that make the predicate true

Examples:

- $X = \{n \in \mathbb{N} : n \text{ is prime}\}$
- $Y = \{x \in \mathbb{R} : x^3 - 3x + 1 > 0\}$
- $Z = \{z \in \text{YouTube_videos} : z \text{ is less than 3 minutes long}\}$

Exercise 1: Put everything together

$$A = \{0, 1, 2\}$$

$$B = \{1, 4, 9\}$$

- Let $A = \{n \in \mathbb{N} : n^2 < 7\}$ and $B = \{1, 4, 9\}$

Find

- $A \cup B$

$$A \cup B = \{0, 1, 2, 4, 9\}$$

- $A \cap B$

$$A \cap B = \{1\}$$

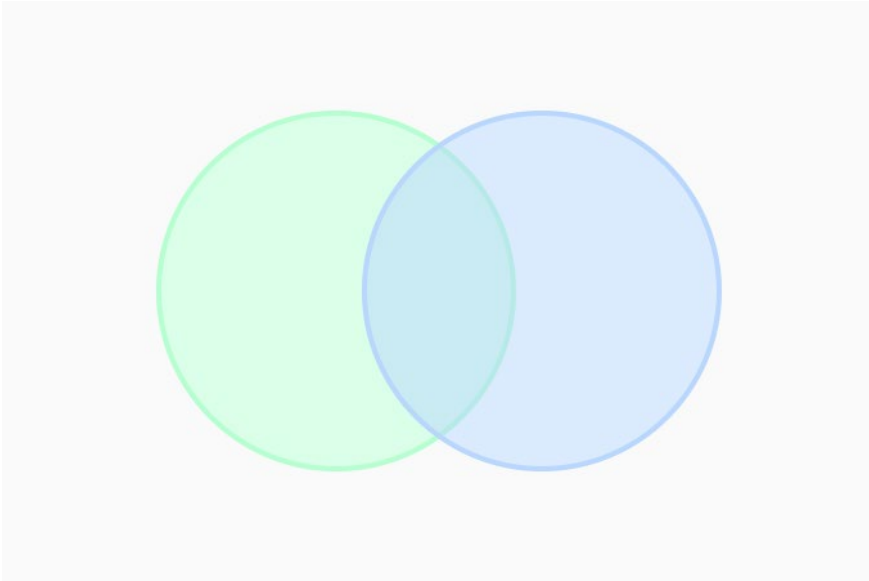
- $A \times B$

$$A \times B = \{(0, 1), (0, 4), \dots\}$$

- $A \setminus B$

$$A \setminus B = \{0, 2\}$$

Venn Diagram

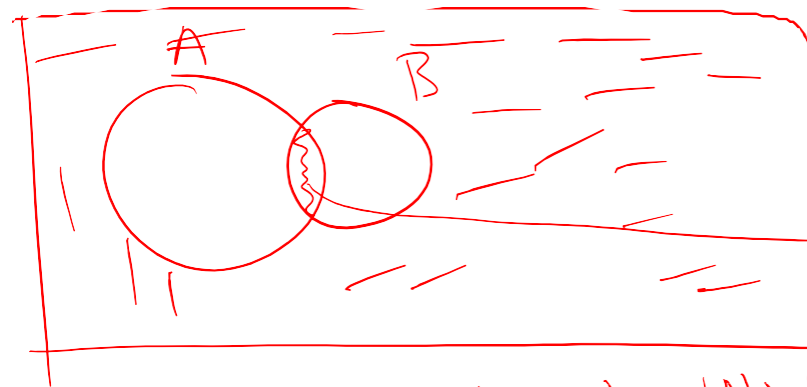


- Represent sets as circles and elements as points within it.
- Elegant way to capture relationships among sets.

Exercise 2: Venn Diagram

- There are 131 students in CS 206.
- 100 like chocolate ice cream. 50 like vanilla ice cream.
- 20 like both chocolate and vanilla ice cream.
- Draw a Venn diagram to represent this.
- How many students do not like either flavor of ice cream.

A = chocolate
B = vanilla



$$|A| = 100$$

$$|B| = 50$$

$$|A \cap B| = 20$$

Want $131 - |A \cup B|$, $|A \cup B| = |A| + |B| - |A \cap B| = 130$
 $\Rightarrow 131 - |A \cup B| = 1$

Functions

- What is a *function*?

- A function *assigns* an **element** of one set to an element of another set
- The **mapping** is done from one set, called ***domain***, to another set, called ***codomain***
- Notation $f: A \mapsto B$

- Examples

- $f: \mathbb{R} \mapsto \mathbb{R}$
- $x \mapsto 4x^2$

The familiar notation $f(a) = b$ indicates that f assigns the element $b \in B$ to a . **Here b would be called the value of f at argument a**

- Example using a formula for b : $f(x) = 4x^2$

Functions - Example

- **Algorithms are functions**

- Example:
- Let $X = \text{set of all web pages}$
- PageRank: $X \mapsto \mathbb{R}$

Types of Functions

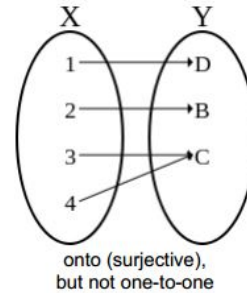
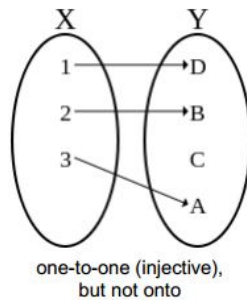
- **Injection** (one-to-one)

- $f: X \mapsto Y$ is injective if each $x \in X$ is mapped to a *different* $y \in Y$.

This function *preserves distinctness* as it never maps distinct elements of its domain to the same elements of its codomain.

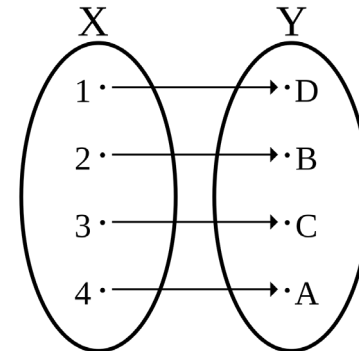
- **Subjection** (onto)

- $f: X \mapsto Y$ is surjective if each $y \in Y$, there exists $x \in X$ such that $f(x) = y$.

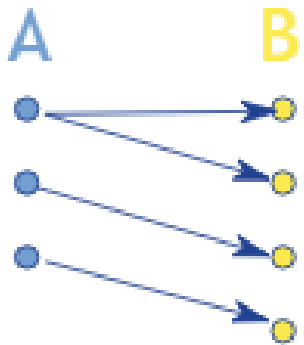


- **Bijection**

- $f: X \mapsto Y$ is a bijection if it is *both one-to-one and onto*.

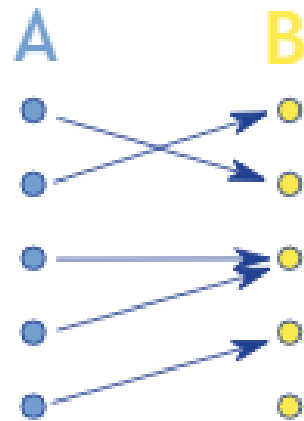


Types of Functions



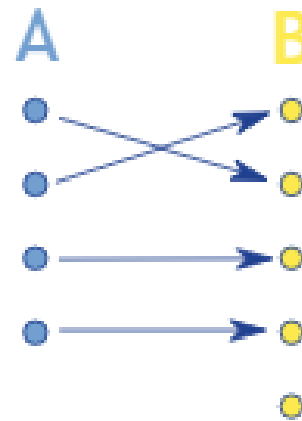
NOT a
Function

A has many B



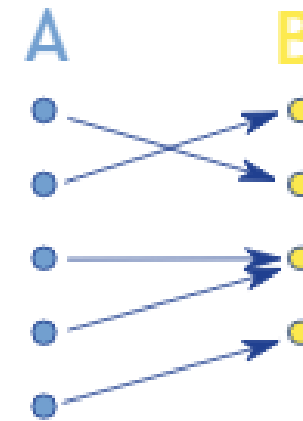
General
Function

B can have many A



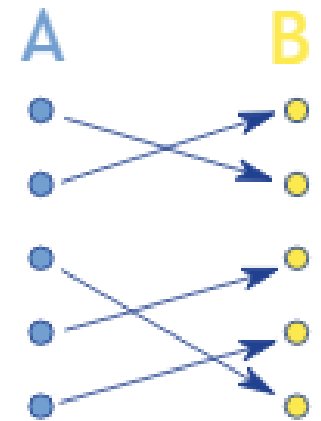
Injective
(not surjective)

B can't have many A



Surjective
(not injective)

Every B has some A



Bijjective
(injective, surjective)

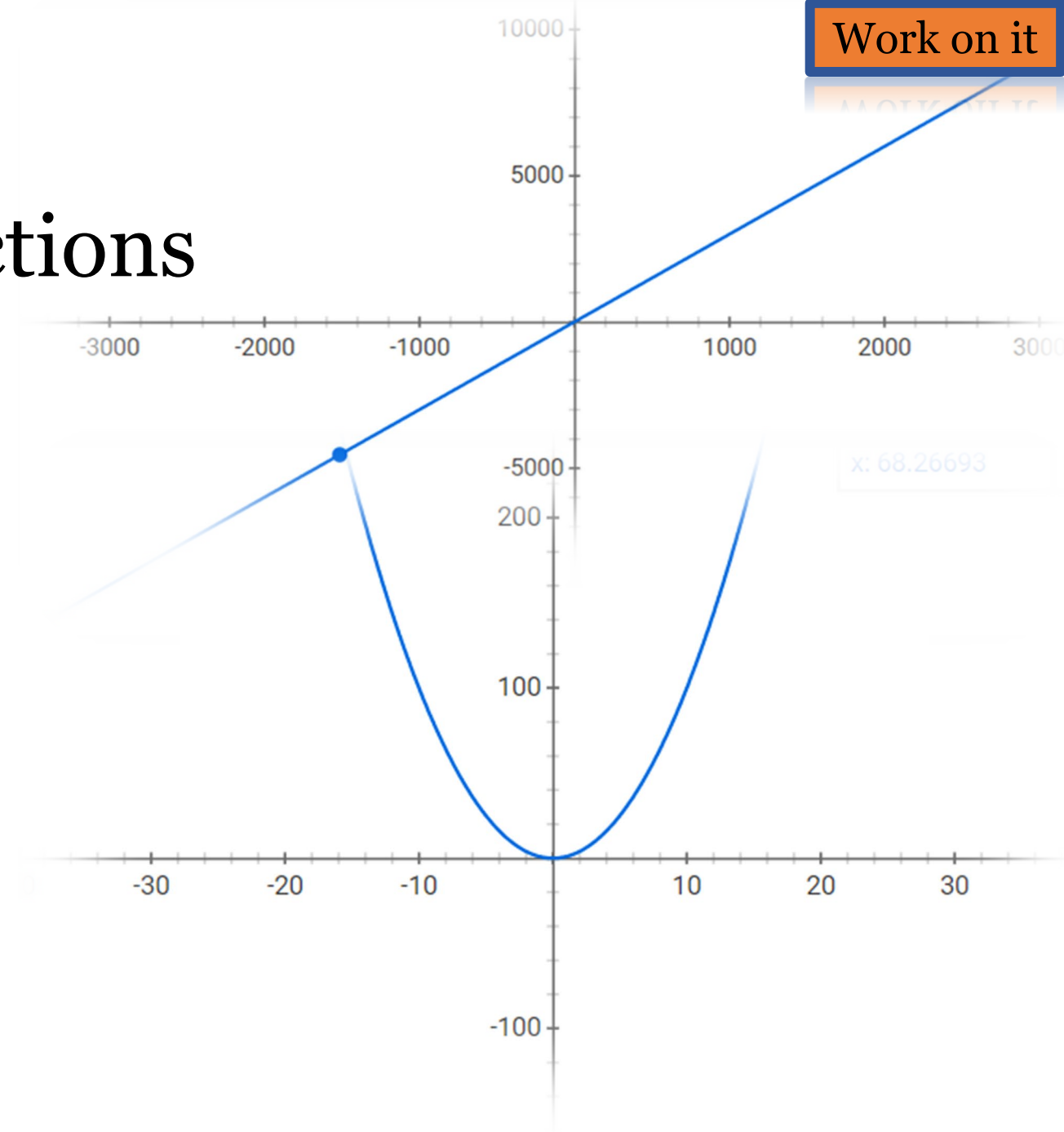
A to B, perfectly

Why bijection is important to us? It allows us to count another set (codomain) and find the number of elements in another set (domain)

Exercise 3: Types of Functions

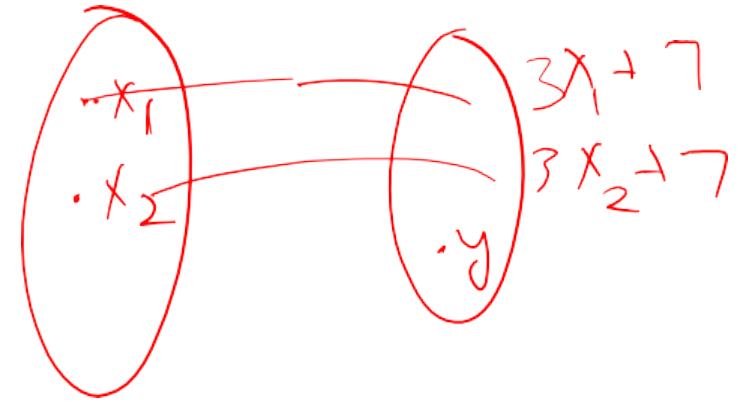
- $f: \mathbb{R} \mapsto \mathbb{R}, f(x) = 3x + 7$

- $f: \mathbb{R} \mapsto \mathbb{R}, f(x) = x^2$



Exercise 3: Types of Functions

- $f: \mathbb{R} \mapsto \mathbb{R}, f(x) = 3x + 7$



— $f(x) = 3x + 7$ is one-to-one

Since if x_1 and x_2 are different then
 $3x_1 + 7$ and $3x_2 + 7$ are also different

— $f(x) = 3x + 7$ is on-to since for any real
 value y , $f\left(\frac{y-7}{3}\right) = y$

Hence $f(x) = 3x + 7$ is a bijection

Exercise 3: Types of Functions

- $f: \mathbb{R} \mapsto \mathbb{R}, f(x) = x^2$

– $f(x) = x^2$ is not one-to-one since
 $f(2) = f(-2) = 4$

– $f(x) = x^2$ is not onto since for
 $y = -3$, no real value x exists such
that $f(x) = -3$

What we will cover today

- Recap
 - ~~Sets~~ ~~Set Operations~~
 - ~~Venn Diagram~~
- Combinatorics Intro (Recap 205)
 - ~~Functions~~
 - Proofs
 - Induction

Proofs

The first two Proofs we will learn:

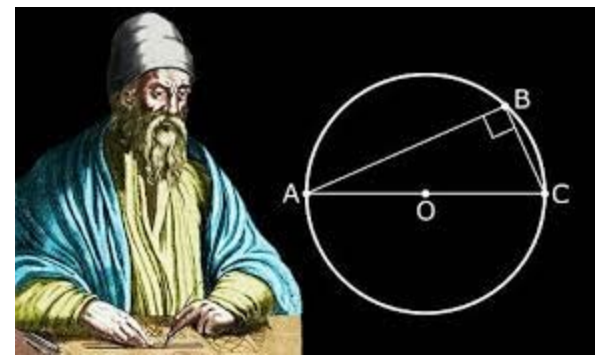
- Direct Proof
- Proof by Contrapositive

Proofs

- A mathematical proof...
 - ...of a **proposition** is a chain of logical deductions from axioms and previously proved statements.
- **Proposition**
 - A statement that is either *true* or *false*
e.g., Every even integer greater than 2 is the sum of two primes
(Goldbach's Conjecture – remains unsolved since 1742...)
- Predicates
 - A **proposition** whose truth depends on the value of variables
 - *e.g., $P(n) ::= "n \text{ is a perfect square}"$ – $P(4)$ is true but $P(5)$ is false*

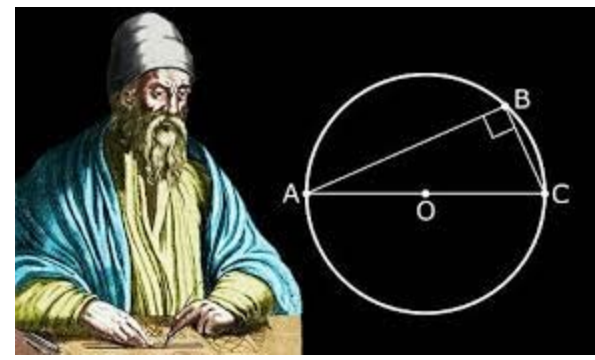
A **prime** is an integer greater than 1 that is not divisible by any other integer greater than 1, e.g., 2, 3, 5, 7, 11, ...

Axioms



- A standard procedure for establishing truth in mathematics was invented by Euclid, a Greek mathematician working in Alexandria, circa 300 BC.
- He began with 5 assumptions about geometry, which seemed undeniable based on direct experience. (For example, “There is a straight line segment between every pair of points.”)
- Propositions like these that are **simply accepted as true** are called axioms
- Starting from these axioms, Euclid established the truth of many additional propositions by providing “proofs.”

Axioms



- Euclid's axiom-and-proof approach, now called the *axiomatic method*, remains the foundation for mathematics today.
- In fact, just a handful of axioms, called the axioms Zermelo-Frankel with Choice (ZFC), together with a few logical deduction rules, ***appear to be sufficient to derive essentially all of mathematics***

Logical Deductions (or Inference Rules)

Used to prove new propositions using previously proved ones

- $$\frac{P, P \Rightarrow Q}{Q}$$

- If P is true and P implies Q , then Q is true.

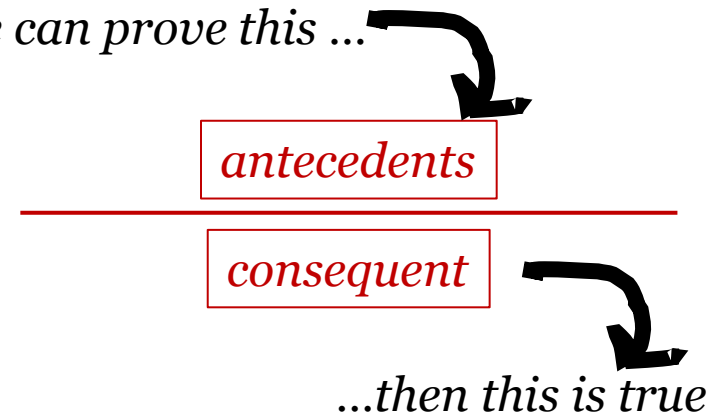
If we can prove this ...

- $$\frac{P \Rightarrow Q, Q \Rightarrow R}{P \Rightarrow R}$$

- If P implies Q and Q implies R , then P implies R .

- $$\frac{\neg P \Rightarrow \neg Q}{Q \Rightarrow P}$$

- If $\neg P$ implies $\neg Q$, then Q implies P



Proving an Implication via Direct Proof

- To prove: $P \Rightarrow Q$
 - Assume that P is true.
 - Show that Q logically follows

Direct Proof

- To prove: $P \Rightarrow Q$

The sum of two even numbers is even.

- Assume that P is true.
- Show that Q logically follows

Proof $x = 2m, y = 2n$

$$x+y = 2m+2n$$

$$= 2(m+n)$$

The product of two odd numbers is odd.

Proof $x = 2m+1, y = 2n+1$

$$xy = (2m+1)(2n+1)$$

$$= 4mn + 2m + 2n + 1$$

$$= 2(2mn+m+n) + 1$$

Example of Proving an Implication

- Theorem: $\overset{P}{1 \leq x \leq 2} \Rightarrow \overset{Q}{x^2 - 3x + 2 \leq 0}$

Assume $1 \leq x \leq 2$

Step 1: $x^2 - 3x + 2 = (x-1)(x-2)$

Step 2: $1 \leq x \Rightarrow (x-1) \geq 0$

Step 3: $x \leq 2 \Rightarrow (x-2) \leq 0$

Step 4: $(x-1) \geq 0, (x-2) \leq 0 \Rightarrow (x-1)(x-2) \leq 0$

Intuition: When x grows, $3x$ grows faster than x^2 in that range.

What we will cover today

- Recap
 - ~~Sets~~ ~~Venn~~ ~~Functions~~ ~~Proofs (Direct)~~
- Combinatorics
 - ~~Proofs~~
 - ~~Direct~~
 - Contrapositive
 - Case Analysis
 - Contradiction
 - Induction
 - Counting
 - Partition Method
 - Difference Method