

Reading and Writing

*Mathematical Proofs*



Slides by Arthur van Goetham

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# What is a proof?

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*Why explanations are not proofs...*

# What is a proof?

A method for establishing truth

What establishes truth **depends on context**

Physics

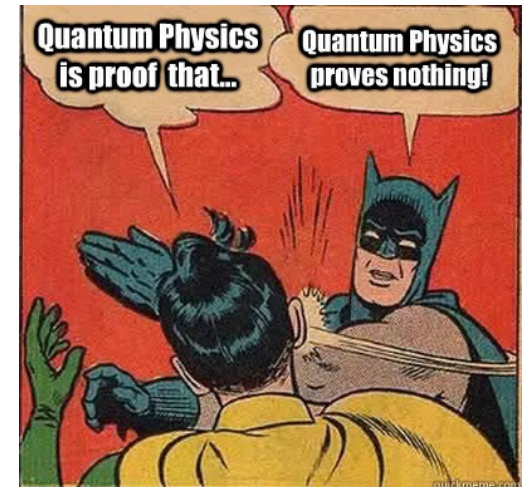
Sufficient experimental evidence

Courtroom

Admissible evidence and witness testimony

Mathematical proof

Not a doubt possible!



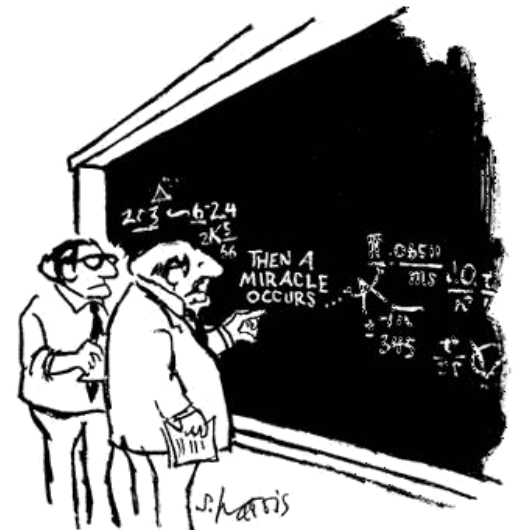
# What is a proof?

A form of communication

Proof must convince reader (*not the writer!*) of correctness

Proofs must be:

- Clearly written
  - Should be easy to follow
  - Very different from “proving process”
- Very precise
  - No ambiguities!
- Leaving no doubts



"I think you should be more explicit here in step two."

# Definition

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## Mathematical proof

A convincing argument for the reader to establish the correctness of a mathematical statement without any doubt.

# Definition

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## Mathematical proof

A convincing argument for the reader to establish the correctness of a **mathematical statement** without any doubt.

↓  
Statement must be true or false

$$~~3 + 6 = 9~~$$

$$3 + 6 = 9$$

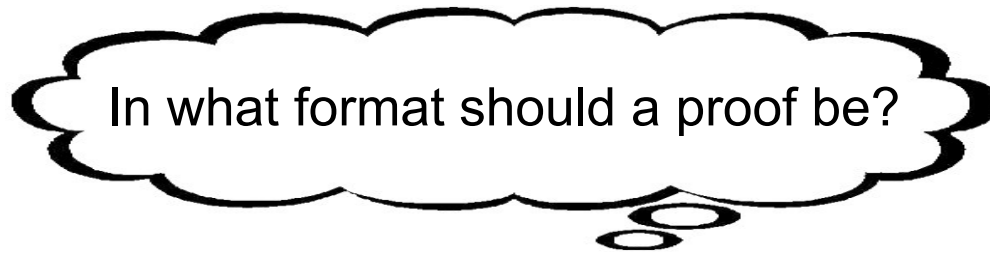


# Definition

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## Mathematical proof

A convincing argument for the reader to establish the correctness of a mathematical statement without any doubt.



# Logical derivation

```
{ Assume: }
(1)  var x; x ∈ ℤ
     { Assume: }
(2)  ∃k[x = 2k + 1]
     { ∃*-elim on (2): }
(3)  x = 2k + 1
     { Mathematics: }
(4)  x2 = (2k + 1)2
     = 4k2 + 4k + 1
     = 2(2k2 + 2k) + 1
     { ∃*-intro on (4) with m = 2k2 + 2k: }
(5)  ∃m[x2 = 2m + 1]
     { ⇒-intro on (2) and (5): }
(6)  ∃k[x = 2k + 1] ⇒ ∃m[x2 = 2m + 1]
     { ∀-intro on (1) and (6) }
(7)  ∀x[∃k[x = 2k + 1] ⇒ ∃m[x2 = 2m + 1]]
```

## Good

- Very systematic
- Hard to make mistakes

## Bad

- Not convenient for statements not stated in logical formulas
- Emphasis on logical reasoning → detract from crux argument
- Hard to read
- Cumbersome



# Common English

## Theorem

If  $x$  is odd, then  $x^2$  is odd

## Proof

Since  $x$  is odd, there exists a  $k \in \mathbb{Z}$  such that  $x = 2k + 1$ . Then,  
 $x^2 = (2k + 1)^2 = 4k^2 + 4k + 1 = 2(2k^2 + 2k) + 1 = 2m + 1$ .

As there exists a  $m \in \mathbb{Z}$  such that  $x^2 = 2m + 1$ ,  $x^2$  is odd.  $\square$

## Good

- Short and to the point
- Easy to read

## Bad

- Logical reasoning somewhat hidden
- Natural language can be ambiguous

This is the kind of proof we expect  
in Data Structures!

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# Basic Proving Techniques

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*Proving 101...*

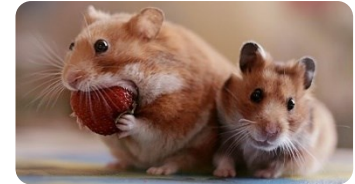


# Overview

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## Basic Proving Techniques

1. Forward-backward method



2. Mathematical induction



3. Case analysis



4. Proof by contradiction



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# Forward-Backward Method

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*How to get from A to B and B to A...*

# Forward-Backward Method

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The most basic approach

Logically combine axioms, definitions, and earlier theorems (**forward**)

Simplify the goal (**backward**)



This should always be your **default approach**

# Usage

## When to use?

Generally used for statements of the form: If **P** then **Q**

Premise                      Goal



Reason **forward** from the premise

Reason **backward** from the goal



### Note



**Thinking:** Reasoning backward and forwards

**Writing:** Reason forward to keep the flow

# Basic Example

## Theorem

If my hamsters do excessive exercise, I will be tired in the morning.

## Proof

My hamsters do excessive exercise  
↓  
They are running in their exercise wheel  
↓  
The exercise wheel is making noise  
↑  
Something is keeping me awake  
↑  
I do not get a good night's sleep  
↓  
I am tired in the morning





# Example

---

## Theorem

If  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$ , then  $f_1(n)f_2(n) = O(g_1(n)g_2(n))$

## Proof

*What does  $f(n) = O(g(n))$  mean again?*



*There exist positive constants  $c$  and  $n_0$  such that  $f(n) \leq c g(n)$  for all  $n \geq n_0$ .*

# Example

---

## Theorem

If  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$ , then  $f_1(n)f_2(n) = O(g_1(n)g_2(n))$

## Proof

By definition there exist positive constants  $c'$  and  $n_0'$  such that  $f_1(n) \leq c' g_1(n)$  for all  $n \geq n_0'$ . Similarly, there exist positive constants  $c''$  and  $n_0''$  such that  $f_2(n) \leq c'' g_2(n)$  for all  $n \geq n_0''$ . We need to show that there exist positive constants  $c$  and  $n_0$  such that  $f_1(n)f_2(n) \leq c g_1(n)g_2(n)$  for all  $n \geq n_0$ .

*We must be very careful with variables! Use different names!*

# Example

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*To establish this, we need to find suitable values for  $c$  and  $n_0$ .*



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*To establish this, we need to find suitable values for  $c$  and  $n_0$ .*

*We already are given constants  $c'$ ,  $c''$ ,  $n_0'$ , and  $n_0''$ .*



# Example

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*To establish this, we need to find suitable values for  $c$  and  $n_0$ .*

*We already are given constants  $c'$ ,  $c''$ ,  $n_0'$ , and  $n_0''$ .*

*Note that  $f_1(n)f_2(n) \leq c'g_1(n) c''g_2(n) = c' c'' g_1(n)g_2(n)$ ,*



# Example

## Theorem

If  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$ , then  $f_1(n)f_2(n) = O(g_1(n)g_2(n))$

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*To establish this, we need to find suitable values for  $c$  and  $n_0$ .*

*We already are given constants  $c'$ ,  $c''$ ,  $n_0'$ , and  $n_0''$ .*

*Note that  $f_1(n)f_2(n) \leq c'g_1(n) c''g_2(n) = c' c'' g_1(n)g_2(n)$ , but only if  $n \geq n_0'$  and  $n \geq n_0''$ .*

*So  $n \geq n_0$  should imply  $n \geq n_0'$  and  $n \geq n_0''$ .*



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Let  $n_0 = \max(n_0', n_0'')$  and  $c = c' c''$ . Then, for all  $n \geq n_0$  (which implies  $n \geq n_0'$  and  $n \geq n_0''$ ),  $f_1(n)f_2(n) \leq c' g_1(n) c'' g_2(n) = c' c'' g_1(n) g_2(n) = c g_1(n) g_2(n)$ .

We have  $f_1(n)f_2(n) \leq c g_1(n) g_2(n)$  for all  $n \geq n_0$ .

Thus,  $f_1(n)f_2(n) = O(g_1(n)g_2(n))$ .  $\square$



# Example

## Theorem

If  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$ , then  $f_1(n)f_2(n) = O(g_1(n)g_2(n))$

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# Overview

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## Basic Proving Techniques

1. Forward-backward method



2. Mathematical induction



3. Case analysis



4. Proof by contradiction



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# Mathematical Induction

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*An introduction to induction...*



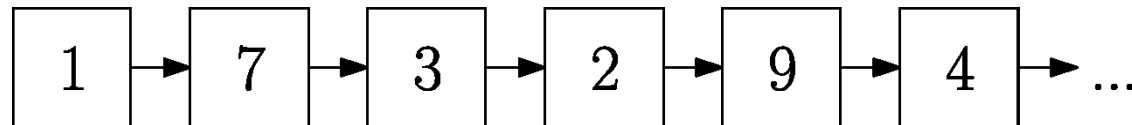
# Recurring structures

Many algorithms and (data)structures have **recurrences**

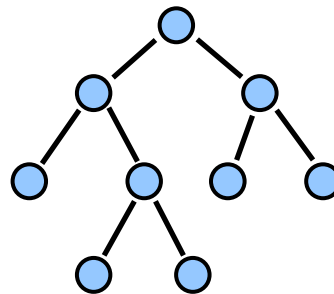
## □ Loop

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

## □ List



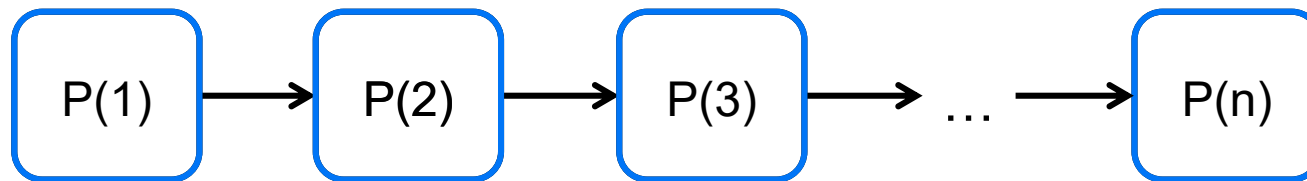
## □ Tree



# The Idea

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## The Base Idea of Induction



### Base Case

One (or more) very simple cases that we can trivially proof.

### Induction Hypothesis

The statement that we want to prove (for any  $n$ ).

### Induction Step

Prove that if the statement holds for a small instance, it must also hold for a larger instance.

# Usage

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## When to use?

- Whenever you need to prove something is true for all values of  $n$ .
  - (or all values  $\geq x$ )
  - Infinite possibilities!
  
- When there is a clear structure in the problem (e.g., trees)
  - We will talk more about this later

# Basic Example

## Theorem

If  $n$  dominos are placed in a row and I push the first; they all fall.

## Proof:

We use induction on  $n$ .

### Base Case ( $n = 1$ ):

If there is only 1 domino, it must also be the first.

I will push the first over, so trivially they all fall.





# Basic Example

## Proof:

We use induction on  $n$ .

### Base Case ( $n = 1$ ):

If there is only 1 domino, it must also be the first.

I will push the first over, so trivially they all fall and the IH holds.

### Induction Hypothesis:

If  $n$  dominos are placed in a row and I push the first; they all fall.

### Induction Step:

Assume the IH holds for  $n$  dominos.

If there were  $n + 1$  dominos in a row, the first  $n$  form a row of length  $n$ .

By IH the first  $n$  dominos will all fall. As all  $n$  dominos fall, so must the  $n^{\text{th}}$  domino. If the  $n^{\text{th}}$  domino falls, then it will tip over the  $n + 1^{\text{th}}$ . The first  $n$  dominos fall over and the  $n + 1^{\text{th}}$  domino also falls over.

So all  $n + 1$  dominos fall over. Thus, the IH holds.



# Basic Example

Proof:

We use induction on  $n$ .

**Base Case** ( $n = 1$ ):

If there is only 1 domino, it must also be the first.

I will push the first over, so trivially they all fall **and the IH holds**.

**Induction Hypothesis:**

If  $n$  dominos are placed in a row and I push the first; they all fall.

**Induction Step:**

**Assume the IH holds for  $n$  dominos.**

If there were  $n + 1$  dominos in a row, the first  $n$  form a row of length  $n$ .

By IH the first  $n$  dominos will all fall. As all  $n$  dominos fall, so must the  $n^{\text{th}}$  domino. If the  $n^{\text{th}}$  domino falls, then it will tip over the  $n + 1^{\text{th}}$ . The first  $n$  dominos fall over and the  $n + 1^{\text{th}}$  domino also falls over.

So all  $n + 1$  dominos fall over. Thus, **the IH holds**.



# Example

---

## Theorem

For all positive integers  $n$ ,  $3^n - 1$  is even.

## Proof:

We use induction on  $n$ .

**Base Case** ( $n = 1$ ):  $3^1 - 1 = 2$ , which is indeed even.

**IH:**  $3^n - 1$  is even.

**Induction Step** ( $n \geq 1$ ):

Assume that  $3^n - 1$  is even. (IH)

We need to show that  $3^{n+1} - 1$  is even.

We have:  $3^{n+1} - 1 = 3 * 3^n - 1 = (2 * 3^n) + (3^n - 1)$ .

A multiplication with an even number is always even ( $2 * 3^n$ ).

By IH,  $(3^n - 1)$  is also even. The sum of two even numbers is also even.

Thus,  $3^{n+1} - 1$  must be even. The IH holds.  $\square$

# Practice 1

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## Theorem

For all positive integers  $n$ ,  $\sum_{k=1}^n k = n(n+1)/2$

# Practice 1

Proof:

We use induction on  $n$ .

**Base case** ( $n = 1$ ):

$$\sum_{k=1}^n k = \sum_{k=1}^1 k = 1 = \frac{1(1+1)}{2} = \frac{n(n+1)}{2}.$$

As both values equate to the same the IH holds.

**IH:**  $\sum_{k=1}^n k = n(n+1)/2$

**Induction Step** ( $n \geq 1$ ):

Suppose that  $\sum_{k=1}^n k = n(n+1)/2$ . (**IH**)

We need to show that  $\sum_{k=1}^{n+1} k = (n+1)(n+2)/2$ .

$$\begin{aligned} \text{We have: } \sum_{k=1}^{n+1} k &= \sum_{k=1}^n k + (n+1) = \frac{n(n+1)}{2} + (n+1) \text{ (by IH)} \\ &= \frac{n(n+1)+2(n+1)}{2} = \frac{(n+1)(n+2)}{2}. \end{aligned}$$

Thus the IH holds and it follows by induction that  $\sum_{k=1}^n k = n(n+1)/2$  for all positive integers  $n$ .  $\square$

# Practice 2

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## Theorem

For every integer  $n \geq 5$ ,  $2^n > n^2$

# Practice 2

## Proof:

We use induction on  $n$ .

**Base case ( $n = 5$ ):**  $2^n = 2^5 = 32 > 25 = 5^2 = n^2$

**IH:**  $2^n > n^2$

**Induction Step ( $n \geq 5$ ):**

Suppose that  $2^n > n^2$  (IH).

We need to show that  $2^{n+1} > (n+1)^2$ .

We have:

$$2^{n+1} = 2 * 2^n > 2 * n^2 \text{ (by IH)}$$

So it is sufficient to show that  $2 * n^2 \geq (n+1)^2 = n^2 + 2n + 1$  for  $n \geq 5$ . This can be simplified to  $n^2 - 2n - 1 \geq 0$  or  $(n-1)^2 \geq 2$ .

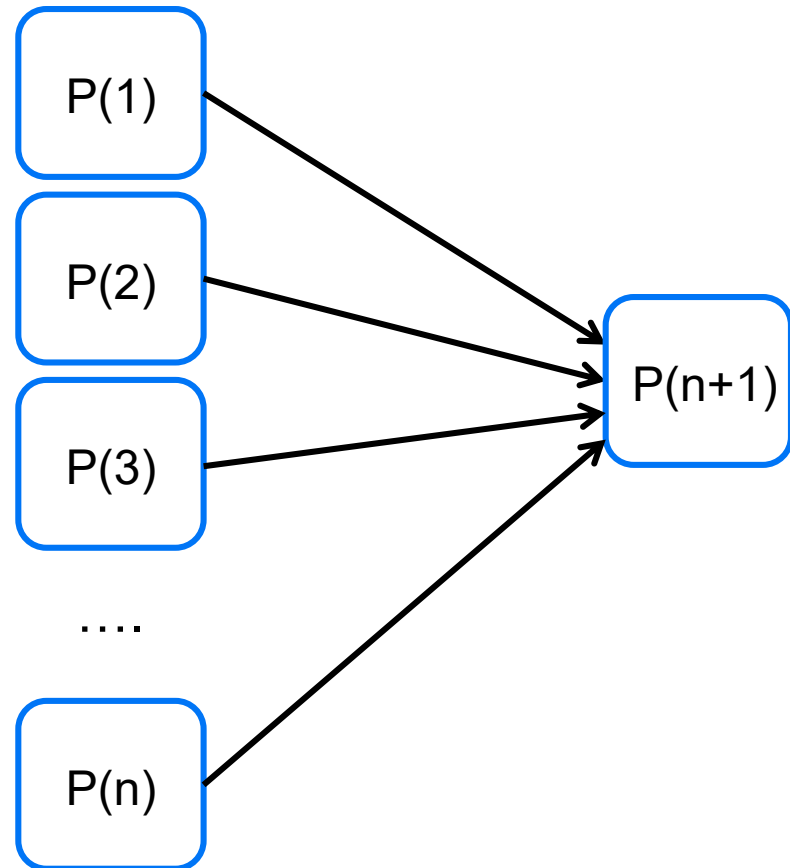
This is clearly true for  $n \geq 5$ .

So it follows by induction that  $2^n > n^2$  for  $n \geq 5$ .  $\square$

# Strong Induction

$P(1)$

$P(1) \wedge \dots \wedge P(n) \Rightarrow P(n+1)$





# Strong Induction

---

## Theorem (Nim)

If the two piles contain the same number of matches at the start of the game, then the second player can always win.

# Strong Induction

## Theorem (Nim)

If the two piles contain the same number of matches at the start of the game, then the second player can always win.

Player 1



Player 2

# Strong Induction

## Theorem (Nim)

If the two piles contain the same number of matches at the start of the game, then the second player can always win.

## Proof

We use strong induction on  $n$ .

**IH:** “If the two piles both contain  $n$  matches at the ... always win”

**Base Case** ( $n = 1$ ):

The first player only has one option, emptying one of the piles. The second player can empty the second pile and, thus, wins.

**Induction Step** ( $n \geq 1$ ):

Assume the second player can always win if there are two piles with  $k$  matchsticks each, for  $1 \leq k \leq n$ . (IH)

We prove the IH for two piles with  $n + 1$  matchsticks each. Assume w.l.o.g. that player 1 takes  $m \geq 1$  matchsticks from the first pile.

The second player can then always take  $m$  matchsticks from the other pile. We are now left with two piles with both  $n + 1 - m \leq n$  matchsticks. By IH, player two can always win from this setting.  $\square$

# Strong Induction

## Theorem (Nim)

If the two piles contain the same number of matches at the start of the game, then the second player can always win.

## Proof

We use **strong** induction on  $n$ .

**IH:** “If the two piles both contain  $n$  matches at the ... always win”

**Base Case** ( $n = 1$ ):

The first player only has one option, emptying one of the piles. The second player can empty the second pile and, thus, wins.

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# Practice 1

## Theorem

It takes  $n - 1$  breaks to break a chocolate bar with  $n \geq 1$  squares into individual squares

## Proof:

We use **strong induction** on  $n$ .

**Base case** ( $n = 1$ ):

It's just 1 square, so  $1 - 1 = 0$  breaks is trivially correct.

**IH:** ...

**Induction Step** ( $n \geq 2$ ):

Consider a chocolate bar with  $n$  squares.

Suppose the chocolate bar is broken into 2 pieces of  $a$  and  $b$  squares, where  $1 \leq a, b < n$  and  $a + b = n$ .

By the IH we need  $a - 1$  breaks for the first part and  $b - 1$  for the second.

Thus, we need  $1 + (a - 1) + (b - 1) = a + b - 1 = n - 1$  breaks.  $\square$



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# Loop Invariant

---

*An introduction to proving loops...*

# Loop Invariant

---

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

What do we want?

How do we prove something is true at the end?

What do we really **know**?

# Loop Invariant

$i = 1$  →

$i = 1$  →

```
sum = 0
```

```
for i = 1 to A.length
```

```
do sum = sum + A[i]
```

What do we really **know**?

At the start:

Sum = 0

= Sum first 0 elements



# Loop Invariant

$i = 2 \rightarrow$   
 $i = 2 \rightarrow$

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

What do we really **know**?

At the start:

Sum = 0

= Sum first 0 elements

After first iteration:

Sum =  $0 + A[1]$

= Sum first 1 element

# Loop Invariant

$i = 3$  →

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

What do we really **know**?

At the start:

Sum = 0

= Sum first 0 elements

After first iteration:

Sum =  $0 + A[1]$

= Sum first 1 element

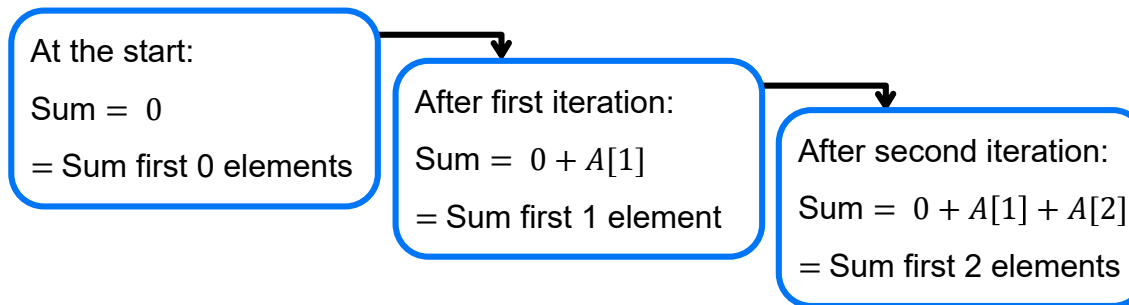
After second iteration:

Sum =  $0 + A[1] + A[2]$

= Sum first 2 elements

# Loop Invariant

Loop Invariants replicate the chain of logical derivations

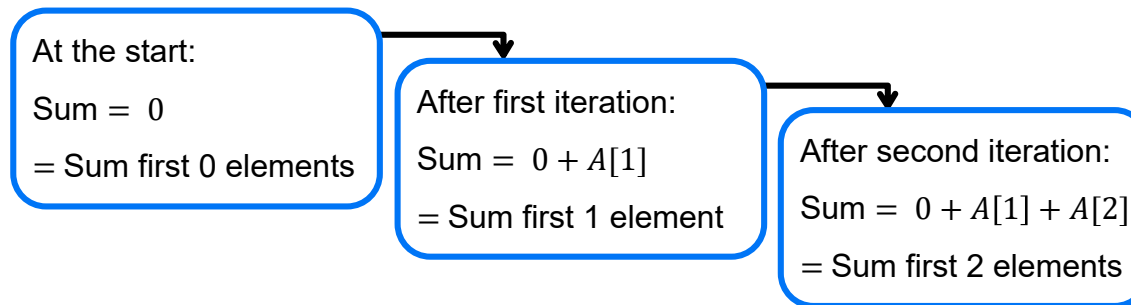


To prove a claim is true at the end, we show...

- ❑ ...it is **true at the start**
- ❑ ...**if** it is **true at the start** of a *random* iteration  $i$ ,  
it is **still true at the start** of the next iteration  $i + 1$
- ❑ ...the claim is **true at the end of the loop**.

# Loop Invariant

Loop Invariants replicate the chain of logical derivations



To prove a statement is true at the end, we need..

- ❑ **Invariant** (What remains true)
- ❑ **Initialization** (Starting conditions)
- ❑ **Maintenance** (Making sure it remains true)
- ❑ **Termination** (Ending conditions)

# Basic Example

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

## Invariant

At the start of iteration  $i$ ,  $sum$  contains the sum of  $A[1..i - 1]$ .

## Initialization

At the start of the loop  $i = 1$  and  $sum = 0$ .

For the loop invariant to hold,  $sum$  must contain the sum of  $A[1..0] = \emptyset$ .

The sum of no elements is trivially 0.

So  $sum$  is correctly set to 0.

# Basic Example

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

## Invariant

At the start of iteration  $i$ ,  $sum$  contains the sum of  $A[1..i - 1]$ .

## Maintenance

**At the start of iteration  $i$** , by the loop invariant  $sum$  contains the sum of  $A[1..i - 1]$ . In iteration  $i$ ,  $sum$  is increased by  $A[i]$ . So  $sum$  is the sum of elements  $A[1..i - 1] + A[i] =$  the sum of elements  $A[1..i] = A[1..i + 1 - 1]$ . Thus the invariant will be maintained.

# Basic Example

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

## Invariant

At the start of iteration  $i$ ,  $sum$  contains the sum of  $A[1..i - 1]$ .

## Termination

The loop terminates when  $i > A.length$ , so  $i = A.length + 1$ .

By the loop invariant we know that  $sum$  contains the sum of  $A[1..A.length + 1 - 1] = A[1..A.length]$ .

This is exactly what we wanted to compute.

# Tips and Tricks

---

## Finding a Loop Invariant

What do you want to know at the end?

Loop Invariant (generally) proves something that is growing  
i.e.,  $A[1..i - 1]$

Think about a specific iteration.

What do you **know**.

Which indices do you need at the start and end.



# Tips and Tricks

---

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

What do you want to know at the end?

I want to show that *sum* contains the sum of all elements in *A*.  
So I need to know something about *sum* and *A*.

**I now know** the loop invariant should contain *A* and *sum*.

# Tips and Tricks

---

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

Loop Invariant (generally) proves something that is growing

What does my loop do?

In each iteration I know something more about the array  $A$ .

I'm going through the loop starting at the beginning of  $A$ .

So **perhaps I can do** something like  $A[1..i - 1]$ .

# Tips and Tricks

---

```
sum = 0
for i = 1 to A.length
  do sum = sum + A[i]
```

## Think about a specific iteration

Let's think about a random iteration 5. What do I know?

I will have seen items 1, 2, 3 and 4.

And assuming my program works, *sum* should be their sum.

The rest of the array **I do not yet know**.

**It seems that:**

*At the start of iteration 5, sum contains the sum of A[1..4]*

# Tips and Tricks

---

## Finding a Loop Invariant

What do you want to know at the end?

Loop Invariant (generally) proves something that is growing  
i.e.,  $A[1..i - 1]$

Think about a specific iteration.

What do you **know**.

Which indices do you need at the start and end.

## Loop Invariant

*At the start of iteration  $i$ ,  $sum$  contains the sum of  $A[1..i - 1]$ .*

# Notes

---

## Invariant

Be careful with  $i$  or  $i - 1$ .

## Maintenance

Use loop invariant at start of loop to prove loop invariant at start of next loop.

## Termination

Requires loop invariant

At which value does the loop terminate?

1. **for**  $i = n$  **downto** 1

2. **do** *stuff*

$i = 0$

1. **while**  $x^2 < n$

2. **do**  $x = x + 1$

$x = \lceil \sqrt{n} \rceil$

1. **while**  $x \leq n$

2. **do**  $x = x + 2$

$x = n+1$  or  $x = n+2$

Termination values?

# Practice

---

Prove **using loop invariant** that...  $y = c$  after the loop.

```
x = c
```

```
y = 0
```

```
while x > 0
```

```
    do x--;
```

```
        y++;
```

# Practice

## Loop Invariant:

At the start of iteration,  $x + y = c$ .

## Initialization:

At the start,  $x = c$  and  $y = 0$ ,  
so  $x + y = c$  which is correct.

```
x = c
```

```
y = 0
```

```
while x > 0
```

```
    do x--;
```

```
        y++;
```

# Practice

## Maintenance:

Assume that the loop invariance holds at the start of loop  $i$ . Then  $x + y = c$ . Let  $x'$  and  $y'$  be the Values of  $x$  and  $y$  at the end of the loop.

We know  $x' = x - 1$  and  $y' = y + 1$ .

But then at the end of the loop it holds that

$$x' + y' = x - 1 + y + 1 = x + y = c.$$

Thus the loop invariant is maintained.

## Termination:

At termination,  $x = 0$ . By the loop invariant we know  $x + y = c$ .

Combining both statements gives  $y = c$ .

```
x = c
```

```
y = 0
```

```
while x > 0
```

```
do x--;
```

```
    y++;
```



---

# Loop Invariant or Induction??

---

*Differences and similarities...*

# (Dis)similarities

---

## Loop Invariant

- ... is a special kind of induction
- ... used to prove **loops** (...obviously...)
- ... has a termination condition

## Induction

- Induction can have multiple base cases
- There are other forms of induction (e.g, structural induction)

## Always

- **Induction Hypothesis** is like **Loop Invariant**
- Maintenance (/Step), **assumes LI (/IH)** and proves it for next.

# Overview

---

## Basic Proving Techniques

1. Forward-backward method



2. Mathematical induction



3. Case analysis



4. Proof by contradiction



---

# Case Analysis

---

*A) Suitcase B) Bookcase C) In case ...*

# Case Analysis

## Case analysis

Prove the theorem by considering a small number of cases

Let's prove  $P \Rightarrow Q$

$P_1 \Rightarrow Q$

$P_2 \Rightarrow Q$

$P_3 \Rightarrow Q$

$P \Rightarrow P_1 \vee P_2 \vee P_3$

$P_1$ ,  $P_2$ , and  $P_3$  describe the different cases

**Don't forget to prove:**  $P_1$  or  $P_2$  or  $P_3$  (one of the cases must hold)!

# Usage

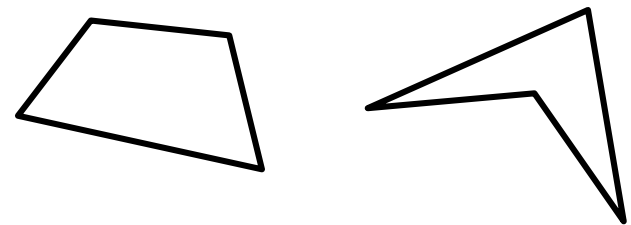
## When to use?

Generally useful for a “for all”-quantifier

- Can be broken down into a small number of configurations

## Examples

- An integer is odd or even
- An integer is positive, negative, or zero
- $x \leq y$  or  $y < x$
- A quadrilateral is convex or not



# Basic Example

---

## Theorem

I do not like any teletubby.

Let's prove  $P \Rightarrow Q$



# Basic Example

## Theorem

For any teletubby, I do not like it.

Let's prove  $P \Rightarrow Q$

## Case 1 (Tinky-Winky):

Is purple.

I don't like purple.

Thus, I do not like Tinky-Winky.

$P_1 \Rightarrow Q$





# Basic Example

## Theorem

For any teletubby, I do not like it.

Let's prove  $P \Rightarrow Q$

## Case 2 ( $P_0$ ):

Has a circle on his head.

I don't like circles.

Thus, I do not like Po.

$P_2 \Rightarrow Q$



# Basic Example

## Theorem

For any teletubby, I do not like it.

Let's prove  $P \Rightarrow Q$

Case 1 (Tinky-Winky):

$P_1 \Rightarrow Q$

...

...

Case 4 (Dispy):

$P_4 \Rightarrow Q$

...



As any teletubby must fall into these categories (by definition), I do not like any teletubby.

$P \Rightarrow P_1 \vee P_2 \vee P_3 \vee P_4$

# Example

---

## Theorem

For any integer  $x$ ,  $x(x + 1)$  is even

## Proof

*Right now we know nothing about  $x$ , which makes it hard to prove that  $x(x + 1)$  is even (we have nothing to work with).*



*What happens if  $x$  is odd?*

*In that case  $(x + 1)$  is even, and hence the multiplication must be even.*



*What happens if  $x$  is even?*

*Doesn't really matter, the multiplication will be even.*



# Example

## Theorem

For any integer  $x$ ,  $x(x + 1)$  is even

## Proof

We consider two cases:

**Case (1):**  $x$  is odd

Then there exists an integer  $k$  such that  $x = 2k + 1$ . Hence,  
$$x(x + 1) = (2k + 1)(2k + 2) = 2(2k + 1)(k + 1).$$

Thus,  $x(x + 1)$  is even.

**Case (2):**  $x$  is even

Then there exists an integer  $k$  such that  $x = 2k$ . Hence,  
$$x(x + 1) = 2k(2k + 1) = 2(2k^2 + k).$$

Thus,  $x(x + 1)$  is even.

Since an integer is either odd or even, this concludes the proof.  $\square$

↑  
Often (incorrectly) omitted

# Practice 1

**Algorithm** LargeEven( $A$ )

large =  $-\infty$

**for**  $i = 1$  **to**  $n$

**if**  $A[i] > \text{large}$  **and**  $A[i]$  is even

**then** large =  $A[i]$

## Loop Invariant

At the start of iteration  $i$ , *large* is the biggest even value in  $A[1..i-1]$  (or  $-\infty$  if there are no even numbers in  $A[1..i-1]$ ).

## Maintenance

We assume the loop invariant (LI) holds at the start of iteration  $i$ . Then *large* is the biggest even value in  $A[1..i-1]$ .

.....

So we have proven the LI is also true at the start of iteration  $i+1$ .

# Practice 1

**Algorithm** LargeEven( $A$ )

large =  $-\infty$

**for**  $i = 1$  **to**  $n$

**if**  $A[i] > \text{large}$  **and**  $A[i]$  is even

**then** large =  $A[i]$

## Assumption

At the start of iteration  $i$ , *large* is the biggest even value in  $A[1..i-1]$   
(or  $-\infty$  if there are no even numbers in  $A[1..i-1]$ )..

## Claim

At the start of iteration  $i+1$ , *large* is the biggest even value in  $A[1..i]$   
(or  $-\infty$  if there are no even numbers in  $A[1..i]$ )...

# Practice 1

---

**Assump:** At the start of iteration  $i$ , *large* is the biggest even value in  $A[1..i-1]$ .

**Claim:** At the start of iteration  $i+1$ , *large* is the biggest even value in  $A[1..i]$ .

**Proof:**

At the start of iteration  $i+1$ , *large* is the biggest even number in  $A[1..i]$ .

There are three cases.

**Case 1)**  $A[i] > \textit{large}$  and  $A[i]$  is odd

As  $A[i]$  is odd it can not change the value of the biggest even number. *Large* was the biggest even number in  $A[1..i-1]$ , so *large* is also the biggest even number in  $A[1..i-1] \cup A[i] = A[1..i]$ .

**Case 2)**  $A[i] \leq \textit{large}$

The biggest even number in  $A[1..i-1]$  is *large*. As  $A[i] \leq \textit{large}$ , the biggest even number in  $A[1..i-1] \cup A[i] = A[1..i]$  is still *large*.

# Practice 1

---

**Assump:** At the start of iteration  $i$ , *large* is the biggest even value in  $A[1..i-1]$ .

**Claim:** At the start of iteration  $i+1$ , *large* is the biggest even value in  $A[1..i]$ .

**Proof:**

At the start of iteration  $i+1$ , *large* is the biggest even number in  $A[1..i]$ .

There are three cases.

**Case 3)**  $A[i] > \textit{large}$  and  $A[i]$  is even

*large* is the biggest even number in  $A[1..i-1]$ , and  $A[i]$  is even bigger than *large*. Then  $A[i]$  is bigger than any number in  $A[1..i-1]$ . So  $A[i]$  is the biggest number in  $A[1..i]$ .

*large* is changed to  $A[i]$ , so *large* now holds the biggest number in  $A[1..i]$ .

As it must either hold that  $A[i] > \textit{large}$  or  $A[i] \leq \textit{large}$  and also either that  $A[i]$  is even or odd, these cases cover all possibilities.

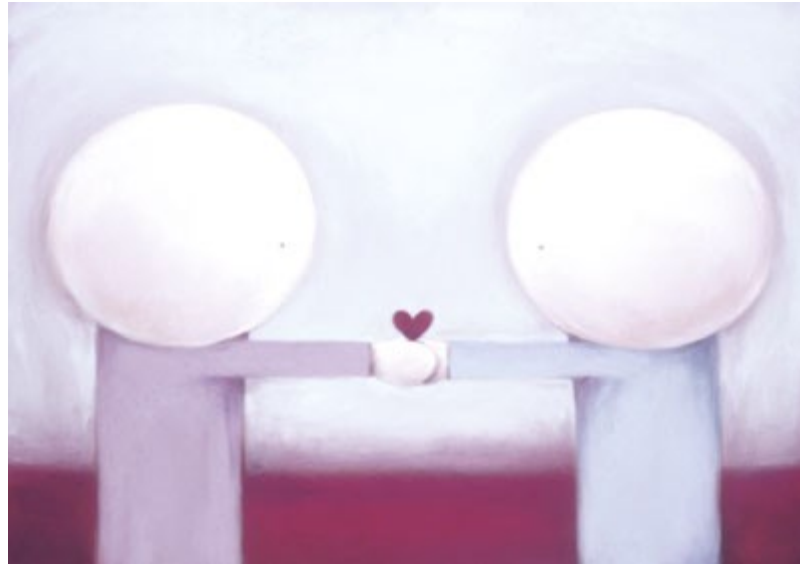


# Practice 2

---

## Theorem

Among any 6 people there are 3 mutual friends or 3 mutual strangers.



# Overview

---

## Basic Proving Techniques

1. Forward-backward method



2. Mathematical induction



3. Case analysis



4. Proof by contradiction



---

# Proof by Contradiction

---

*It's elementary...*

# Contradiction

*“When you have eliminated the impossible, whatever remains, however improbable, must be the truth”*



## Proof by Contradiction

- ❑ Assume the negation and show that “it is impossible”
- ❑ To prove  $Q$ :
  - Assume  $\neg Q$  and derive contradiction (false) by forward reasoning
- ❑ To prove  $\neg Q$ :
  - Assume  $Q$  and derive contradiction...
- ❑ Very powerful technique!

# Usage

## When to use?

- Useful when the negation of the statement is easier to work with
- Useful when the negation as a premise gives more information
  - E.g. when the negation has a “there exists”-quantifier

- Always try this method if you're stuck!



# Basic Example

## Theorem

I never leave my house without my Ferrari

## Proof

For sake of contradiction,

assume I did leave my house without my Ferrari.

But then I would not look cool (by Lemma X).

I *am* very cool 🧐 (by Axiom Y).

Contradiction, thus the assumption must be false.

Hence, I never leave my house without my Ferrari.



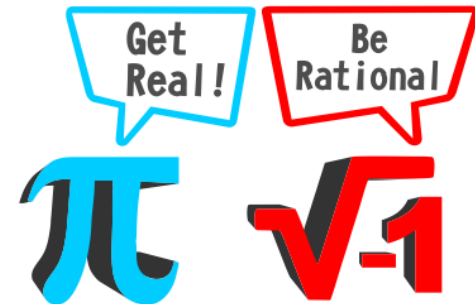
# Rational Numbers

## Definition

A number  $x$  is **rational** if there exists integers  $a$  and  $b$  such that  $x = a / b$

## Examples

- 6,  $\frac{1}{3}$ , and  $-\frac{5}{8}$  are rational
- $\pi$  and  $e$  are **irrational** (not rational)



# Example

---

## Theorem

$\sqrt{2}$  is irrational

## Proof

*We should prove there exist no integers  $a, b$  such that  $\sqrt{2} = a/b$ .*

*What can we do with that? Not sure...*

*How about a proof by contradiction?*

*That means we assume that such  $a$  and  $b$  **do** exist.*

*What is wrong with that?*



# Example

## Theorem

$\sqrt{2}$  is irrational

## Proof

**For the sake of contradiction**, assume there exist integers  $a$  and  $b$  such that  $\sqrt{2} = a/b$ . **Without loss of generality** we assume  $b > 0$  (why?).

Square both sides and rewrite to obtain  $2b^2 = a^2$ .

This means that  $a^2$  is even and thus  $a$  is even.

Hence there exists a  $k$  such that  $a = 2k$ .

But then  $2b^2 = a^2 = (2k)^2$  or  $b^2 = 2k^2$ , and thus  $b$  is also even.

*So both  $a$  and  $b$  are even.*

*If  $b = 2m$ , then  $a/b = 2k/2m = k/m = \sqrt{2}$ .*

*And  $k$  and  $m$  are **smaller** integers. The same argument for  $k$  and  $m$  gives even smaller integers. This cannot go on forever!*

# Example

## Theorem

$\sqrt{2}$  is irrational

## Proof

For the sake of contradiction, let  $a$  and  $b$  be the **smallest positive** integers such that  $\sqrt{2} = a/b$ . Square both sides and rewrite to obtain  $2b^2 = a^2$ . This means that  $a^2$  is even and thus  $a$  is even.

Hence there exists a  $k$  such that  $a = 2k$ .

But then  $2b^2 = a^2 = 4k^2$  or  $b^2 = 2k^2$ , thus there exists an integer  $m$  such that  $b = 2m$ . We get that  $a/b = 2k/2m = k/m = \sqrt{2}$ .

But  $k$  and  $m$  are smaller than  $a$  and  $b$ , which contradicts the assumption that  $a$  and  $b$  are smallest positive integers such that  $\sqrt{2} = a/b$ . Thus, **we find a contradiction** and our assumption must be false. Thus, there exists no  $a$  and  $b$  such that  $\sqrt{2} = a/b$  and it must be that  $\sqrt{2}$  is irrational.  $\square$

# Practice

---

**Theorem:**  $n^2 \log n \neq O(n^2)$

## Proof

For the sake of contradiction, assume that there exist positive constants  $c$  and  $n_0$  such that  $n^2 \log n \leq c n^2$  for all  $n \geq n_0$ .

By dividing both sides by  $n^2$ , we obtain that  $\log n \leq c$  for all  $n \geq n_0$ .

This is false for  $n = \max(2^{c+1}, n_0)$ , since then

$$\log n \geq \log 2^{c+1} = c + 1 > c.$$

This contradicts that  $\log n \leq c$  for all  $n \geq n_0$ .

Thus,  $n^2 \log n \neq O(n^2)$ .  $\square$

*Usually it is sufficient to say that the function  $f(n)$  (in this case:  $\log n$ ) is unbounded. This automatically implies that, for any constant  $c$ , there exists an  $n$  large enough such that  $f(n) > c$ .*

# Practice

---

## Theorem

$$n^2 \log n \neq O(n^2)$$

## Proof

For the sake of contradiction, assume that there exist positive constants  $c$  and  $n_0$  such that  $n^2 \log n \leq c n^2$  for all  $n \geq n_0$ .

By dividing both sides by  $n^2$ , we obtain that  $\log n \leq c$  for all  $n \geq n_0$ .

As  $\lim_{n \rightarrow \infty} \log n = \infty$ , there can not exist a constant  $c$  that is always larger. Thus, the assumption must be false.  $\square$

---

# Common Errors

---

*As can be seen in Figure 4 this is true...*

# Find the correct proofs!

---

The word 'QUIZ!' is rendered in a bold, 3D font. The letters are primarily red with a glossy finish, and the interior of the letters is white. The text is set against a plain white background and casts a soft, light-colored shadow on the surface below it.

# Correct or not? - Test



## Theorem

In every set of  $n \geq 1$  horses, all horses have the same color

## Proof

We use induction on  $n$ .

**Base case** ( $n = 1$ ):

There is only one horse, so it must be true. The IH holds.

**IH:** In every set of  $n \geq 1$  horses, all horses have the same color.

**Step** ( $n \geq 1$ ):

Suppose that in every set of  $n$  horses, all horses have the same color (IH).

We need to show that any set of  $n + 1$  horses share the same color.

By the IH, the first  $n$  horses have the same color. Similarly, by the IH, the last  $n$  horses have the same color. Thus all horses have the same color.  $\square$

# Base Case not reached (NOT correct)

## Theorem

In every set of  $n \geq 1$  horses, all horses have the same color

## Proof

We use induction on  $n$ .

**Base case** ( $n = 1$ ):

There is only one horse, so it must be true. The IH holds.

**IH:** In every set of  $n \geq 1$  horses, all horses have the same color.

**Step** ( $n \geq 1$ ):

Suppose that in every set of  $n$  horses, all horses have the same color (IH).

We need to show that any set of  $n + 1$  horses share the same color.

By the IH, the first  $n$  horses have the same color. Similarly, by the IH, the last  $n$  horses have the same color. Thus all horses have the same color.  $\square$



# Correct or not?

---

## Theorem

In a sorted list duplicates are always next to each other.

## Proof

If we look at a sorted list, for example  $[1,3,3,4,7]$  both values of 3 are next to each other in the list. Clearly, this list is sorted and both values are next to each other.

Thus, duplicates must be next to each other in a sorted list.

# Proof by Example (NOT correct)

---

## Theorem

In a sorted list duplicates are always next to each other.

## Proof

If we look at a sorted list, **for example** [1,3,3,4,7] both values of 3 are next to each other in the list. Clearly, this list is sorted and both values are next to each other.

Thus, duplicates must be next to each other in a sorted list.

# Correct or not?

---

## Theorem

For any integer  $x$ ,  $x(x + 1)$  is even

## Proof

We consider two cases:

**Case (1):**  $x$  is odd

Then there exists an integer  $k$  such that  $x = 2k + 1$ . Hence,

$$x(x + 1) = (2k + 1)(2k + 2) = 2(2k + 1)(k + 1).$$

Thus,  $x(x + 1)$  is even.

**Case (2):**  $x$  is even

Then there exists an integer  $k$  such that  $x = 2k$ . Hence,

$$x(x + 1) = 2k(2k + 1) = 2(2k^2 + k).$$

Thus,  $x(x + 1)$  is even.

# Finishing proofs (NOT correct)

## Theorem

For any integer  $x$ ,  $x(x + 1)$  is even

## Proof

We consider two cases:

**Case (1):**  $x$  is odd

Then there exists an integer  $k$  such that  $x = 2k + 1$ . Hence,

$$x(x + 1) = (2k + 1)(2k + 2) = 2(2k + 1)(k + 1).$$

Thus,  $x(x + 1)$  is even.

**Case (2):**  $x$  is even

Then there exists an integer  $k$  such that  $x = 2k$ . Hence,

$$x(x + 1) = 2k(2k + 1) = 2(2k^2 + k).$$

Thus,  $x(x + 1)$  is even.

# Proof Techniques Summary

## Basic Proving Techniques

1. Forward-backward method



2. Mathematical induction



3. Case analysis



4. Proof by contradiction

