Mathematical Induction Part Two

Outline for Today

• Variations on Induction

 Starting later, taking different step sizes, and more!

• "Build Up" versus "Build Down"

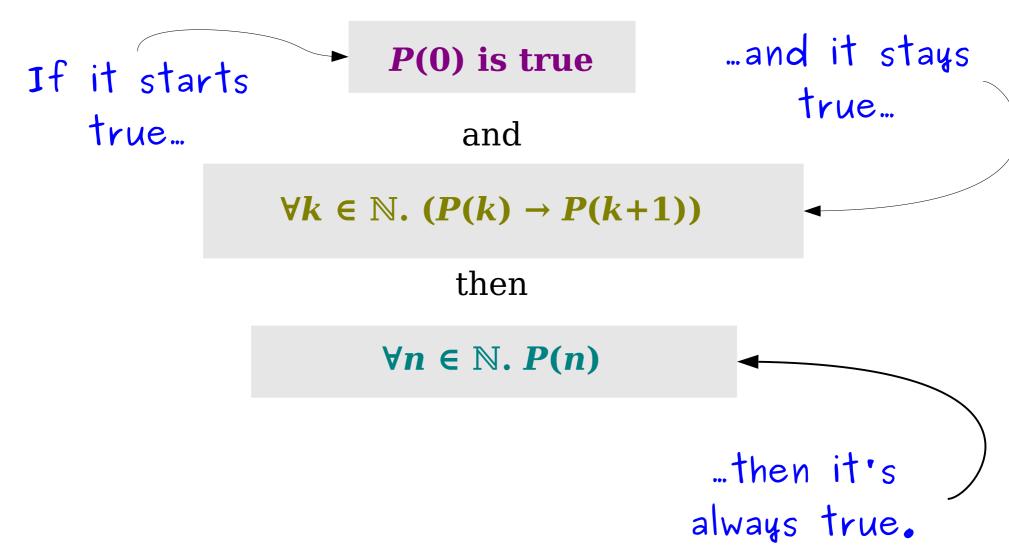
 An inductive nuance that follows from our general proofwriting principles.

Complete Induction

When one assumption isn't enough!

Recap from Last Time

Let P be some predicate. The **principle of mathematical induction** states that if



Try It!

Starting with MI, apply these operations to make MU:

- (a) Double the string after an M.
- (b) Replace III with U.
- (c) Append u, if the string ends in I.(d) Delete uu from the string.

Not a single person in this room was able to solve this puzzle.

Are we even sure that there is a solution?

Counting I's



The Key Insight

- Initially, the number of **I**'s is *not* a multiple of three.
- To make MU, the number of I's must end up as a multiple of three.
- Can we *ever* make the number of **I**'s a multiple of three?

Lemma 1: If n is an integer that is not a multiple of three, then n-3 is not a multiple of three.

Lemma 2: If n is an integer that is not a multiple of three, then 2n is not a multiple of three.

- **Lemma 1:** If n is an integer that is not a multiple of three, then n-3 is not a multiple of three.
- **Proof:** By contrapositive; we'll prove that if n-3 is a multiple of three, then n is also a multiple of three. Because n-3 is a multiple of three, we can write n-3=3k for some integer k. Then n=3(k+1), so n is also a multiple of three, as required. \blacksquare
- **Lemma 2:** If n is an integer that is not a multiple of three, then 2n is not a multiple of three.
- **Proof:** Let n be a number that isn't a multiple of three. If n is congruent to one modulo three, then n = 3k + 1 for some integer k. This means 2n = 2(3k+1) = 6k + 2 = 3(3k) + 2, so 2n is not a multiple of three. Otherwise, n must be congruent to two modulo three, so n = 3k + 2 for some integer k. Then 2n = 2(3k+2) = 6k+4 = 3(2k+1) + 1, and so 2n is not a multiple of three.

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Case 1: Double the string after the M.

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Theorem: The MU puzzle has no solution.

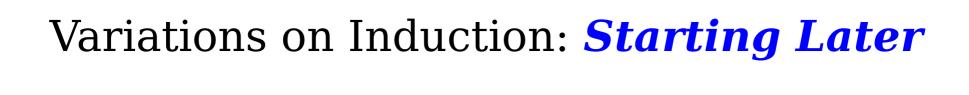
Proof: Assume for the sake of contradiction that the MU puzzle has a solution and that we can convert MI to MU. This would mean that at the very end, the number of I's in the string must be zero, which is a multiple of three. However, we've just proven that the number of I's in the string can never be a multiple of three.

We have reached a contradiction, so our assumption must have been wrong. Thus the MU puzzle has no solution. ■

Algorithms and Loop Invariants

- The proof we just made had the form
 - "If *P* is true before we perform an action, it is true after we perform an action."
- We could therefore conclude that after any series of actions of any length, if P was true beforehand, it is true now.
- In algorithmic analysis, this is called a *loop* invariant.
- Proofs on algorithms often use loop invariants to reason about the behavior of algorithms.
 - Take CS161 for more details!

New Stuff!



Induction Starting at 0

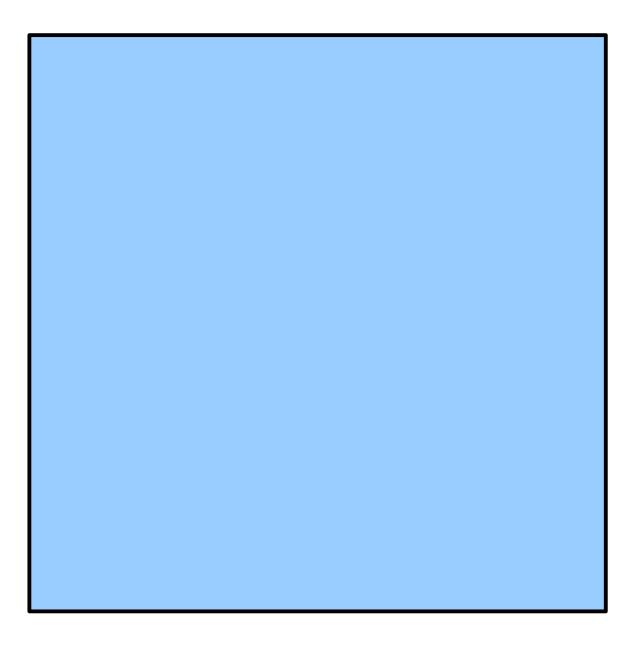
- To prove that P(n) is true for all natural numbers greater than or equal to 0:
 - Show that P(0) is true.
 - Show that for any $k \ge 0$, that if P(k) is true, then P(k+1) is true.
 - Conclude P(n) holds for all natural numbers greater than or equal to 0.

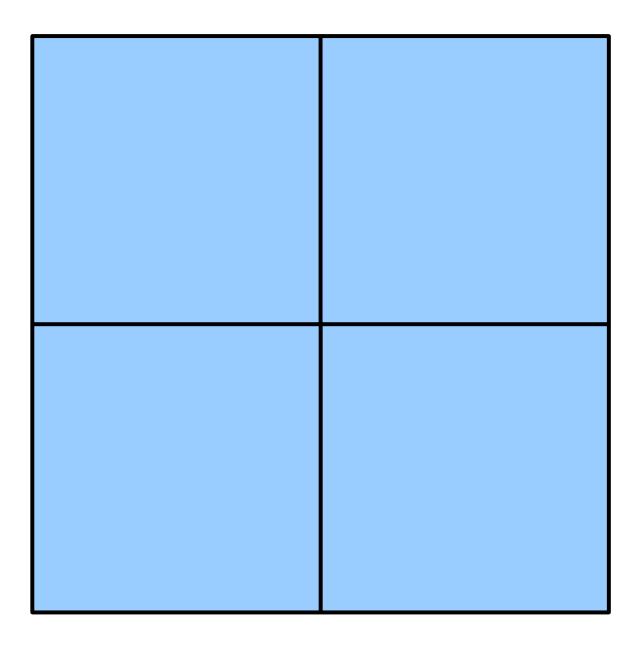
Induction Starting at m

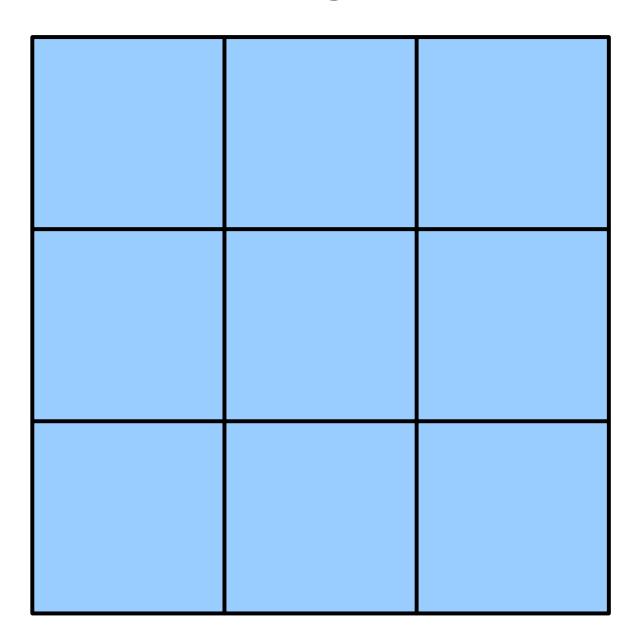
- To prove that P(n) is true for all natural numbers greater than or equal to m:
 - Show that $P(\mathbf{m})$ is true.
 - Show that for any $k \ge m$, that if P(k) is true, then P(k+1) is true.
 - Conclude P(n) holds for all natural numbers greater than or equal to m.

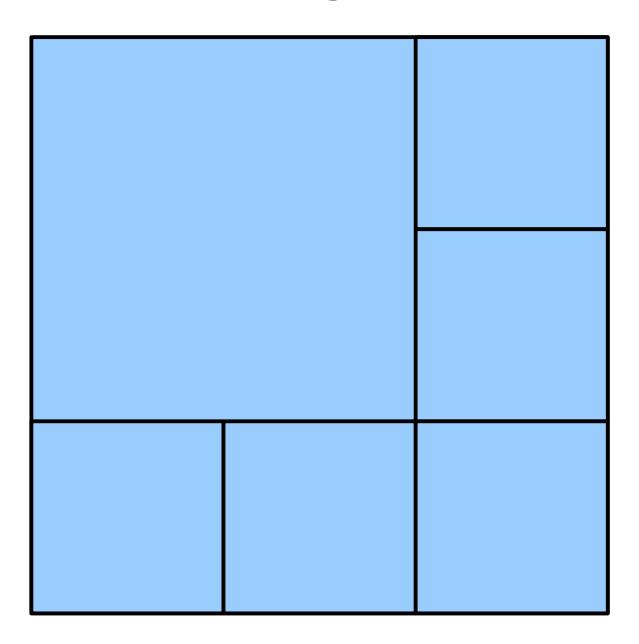
Variations on Induction: Bigger Steps

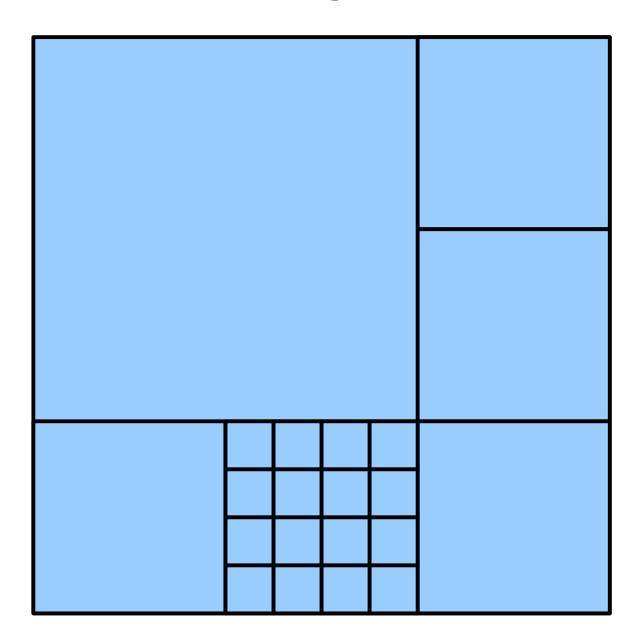
Subdividing a Square

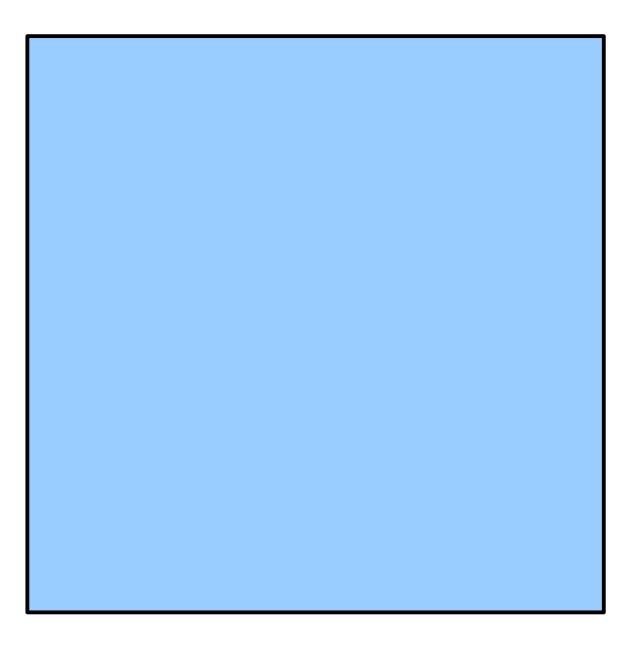


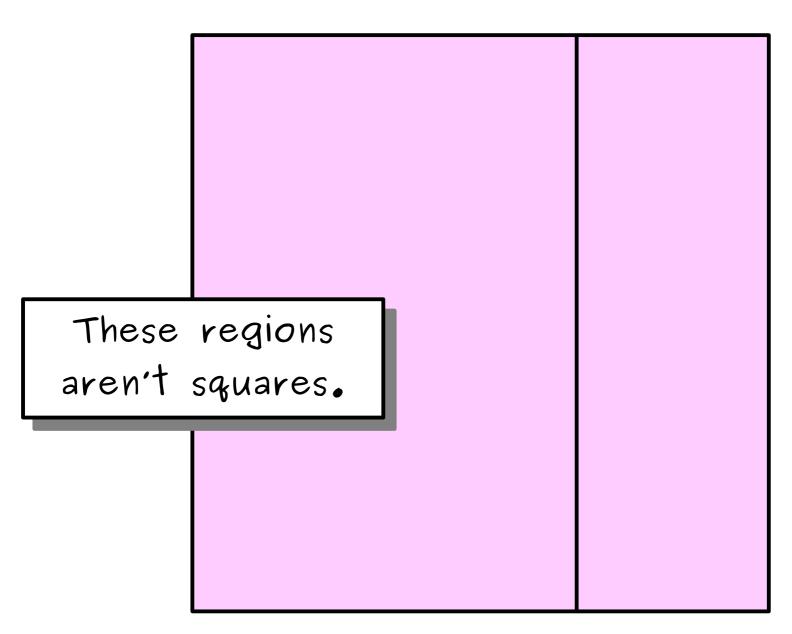


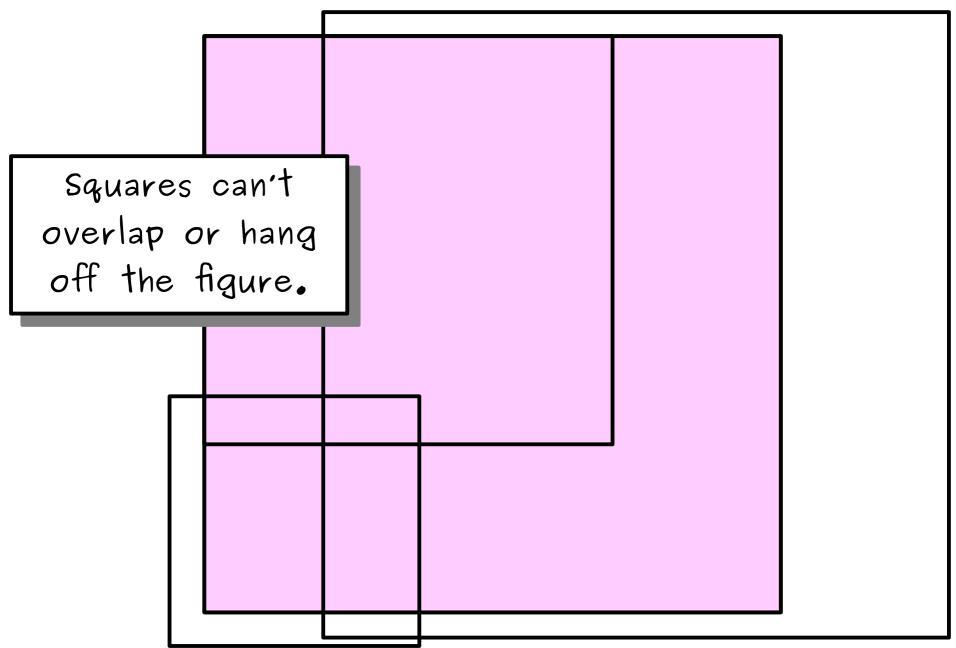












For what values of *n* can a square be subdivided into *n* squares?

Try out some numbers *n* from 1 to 13. Which values of *n* work?

Answer at https://pollev.com/cs103

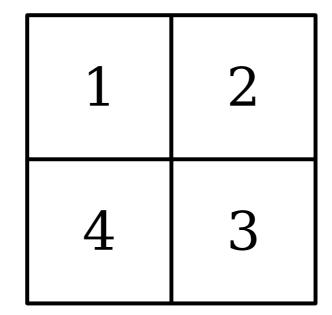
 $1 \quad 2 \quad 3 \quad 4 \quad 5 \quad 6 \quad 7 \quad 8 \quad 9 \quad 10 \quad 11 \quad 12$

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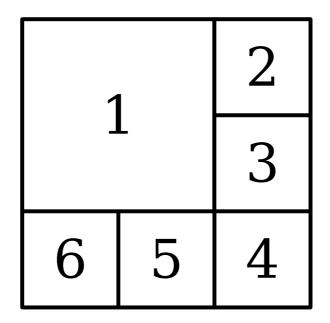
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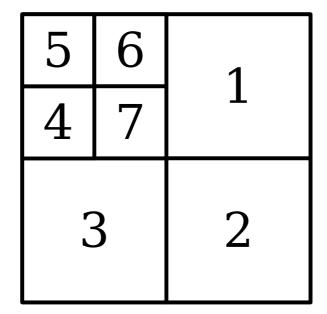
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1 2 3 4 5 6 7 8 9 10 11 12

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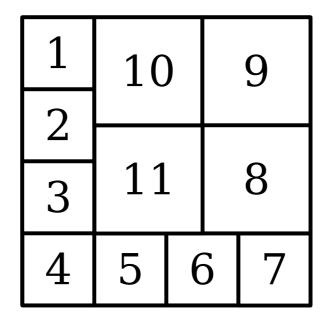
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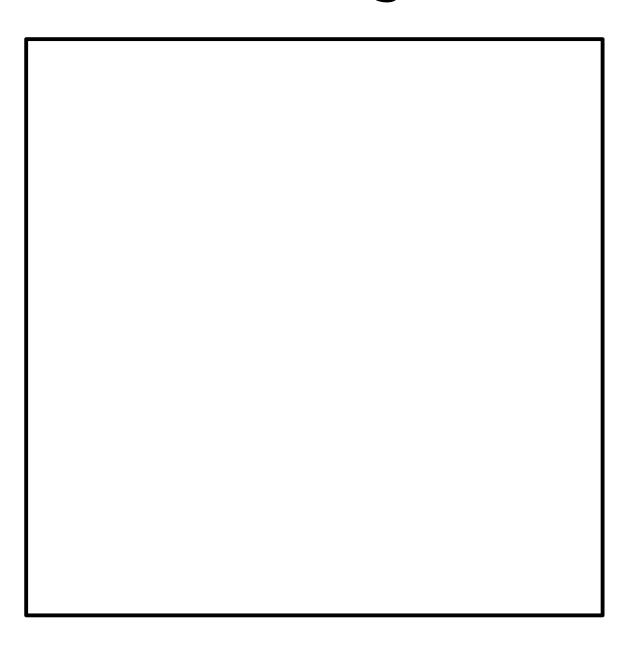
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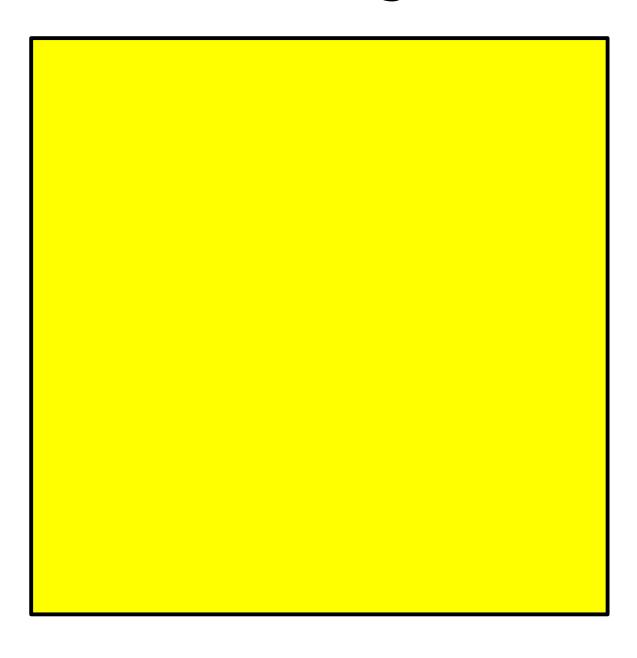
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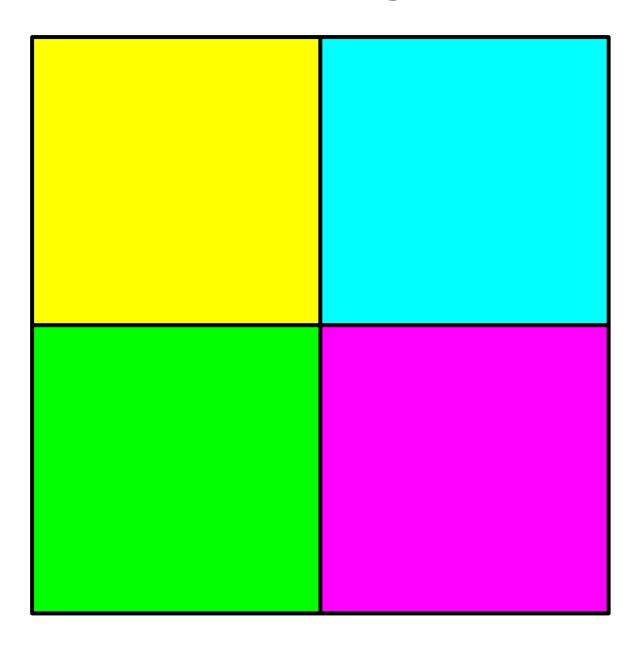
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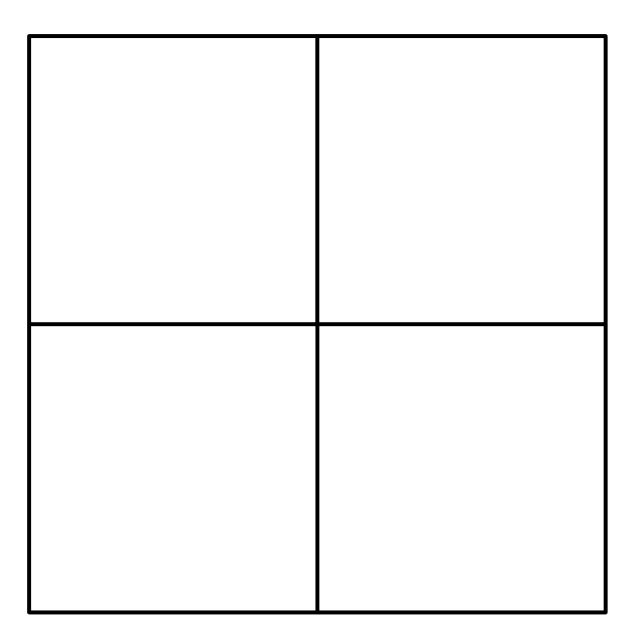
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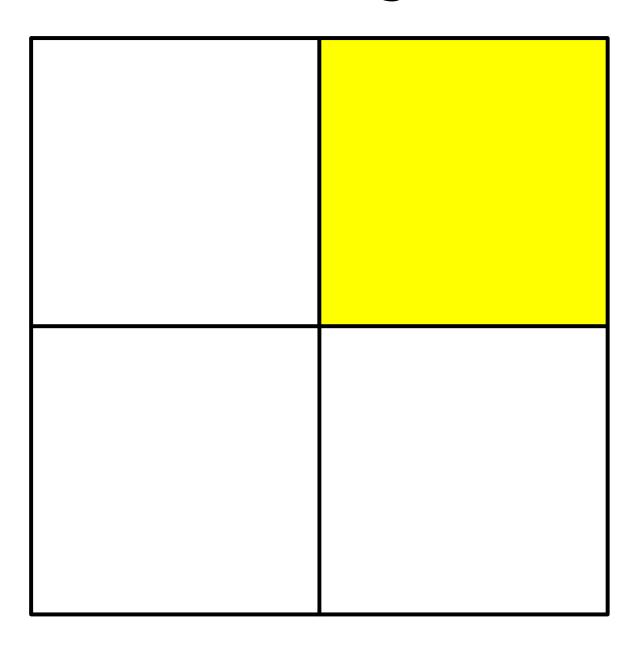


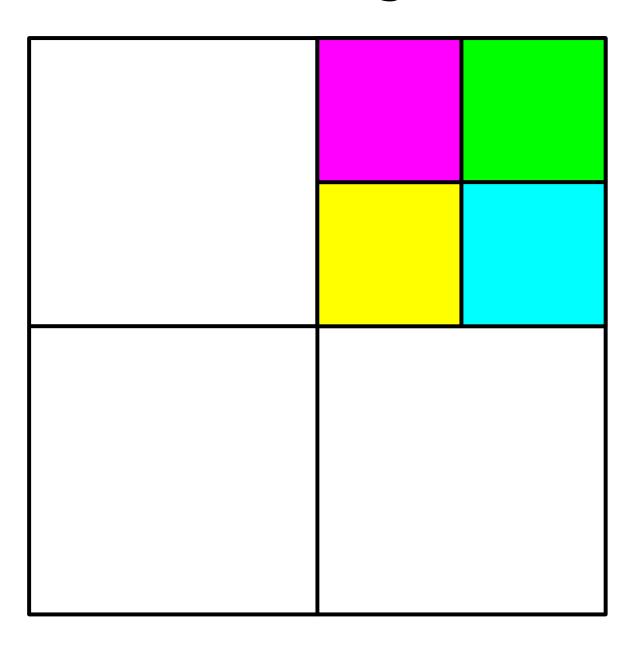


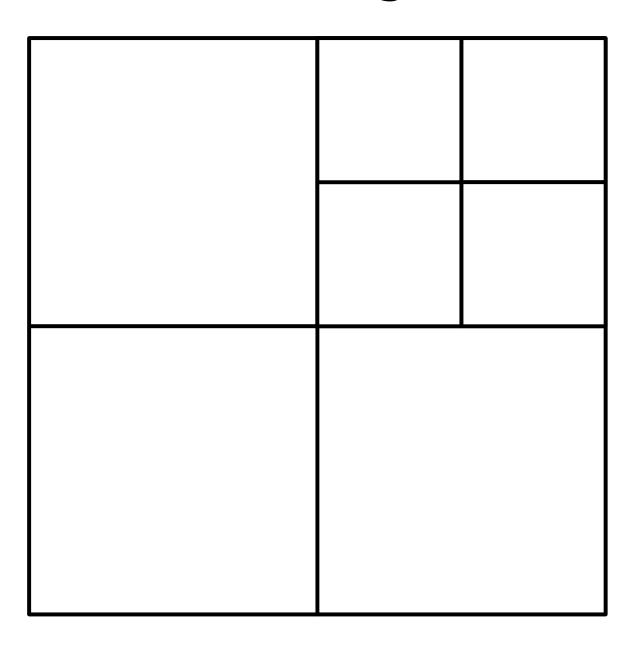


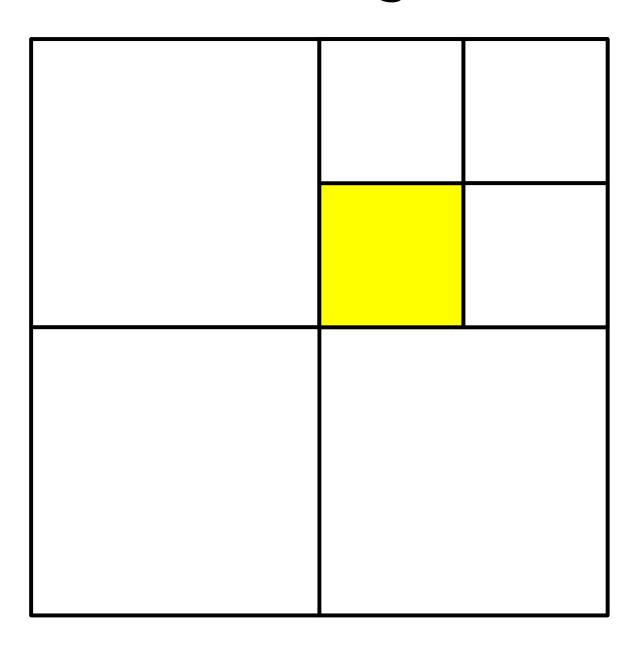


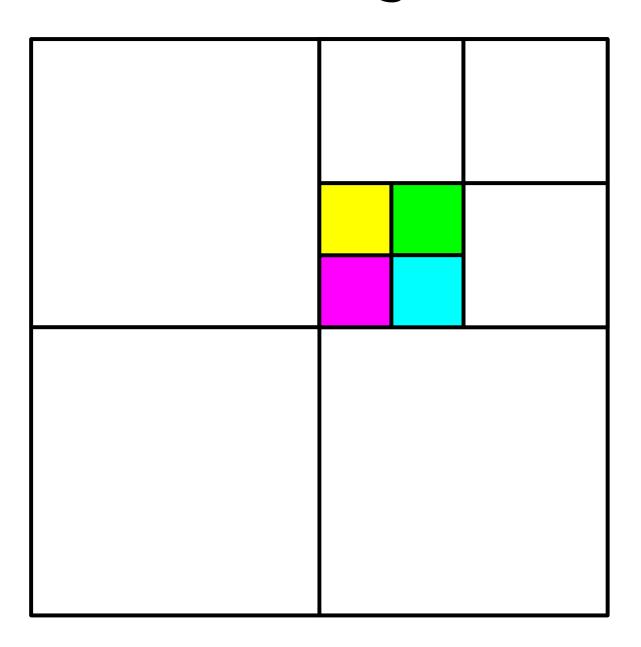


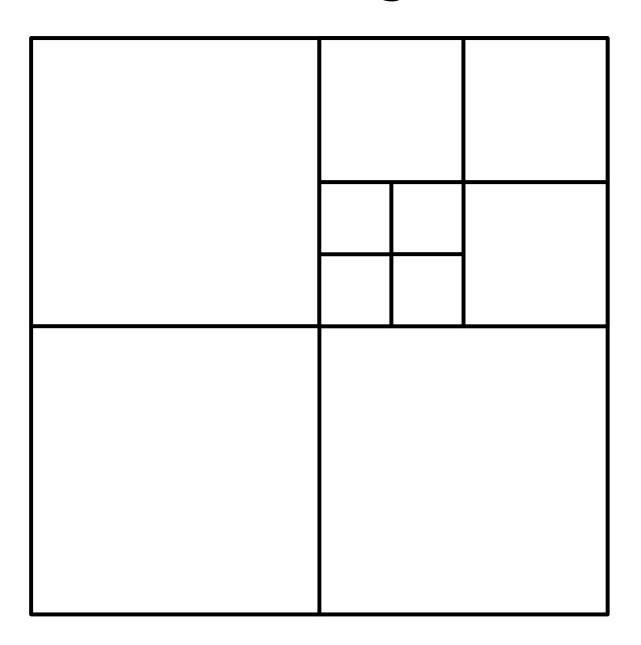












- If we can subdivide a square into n squares, we can also subdivide it into n + 3 squares.
- Since we can subdivide a bigger square into 6, 7, and 8 squares, we can subdivide a square into n squares for any $n \ge 6$:
 - For multiples of three, start with 6 and keep adding three squares until *n* is reached.
 - For numbers congruent to one modulo three, start with 7 and keep adding three squares until *n* is reached.
 - For numbers congruent to two modulo three, start with 8 and keep adding three squares until *n* is reached.

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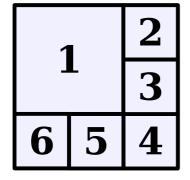
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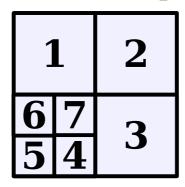
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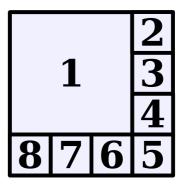
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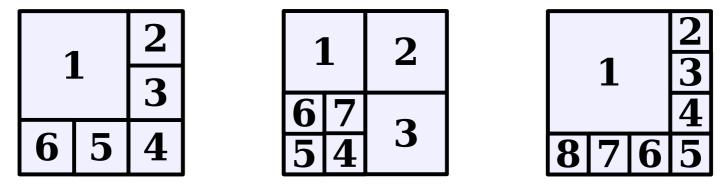






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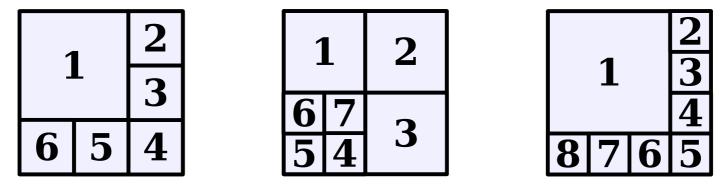
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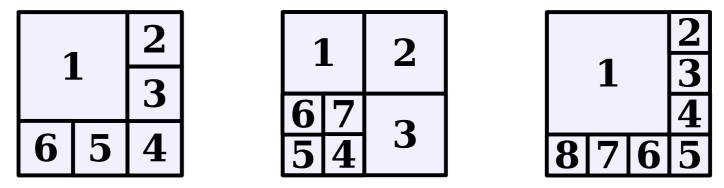
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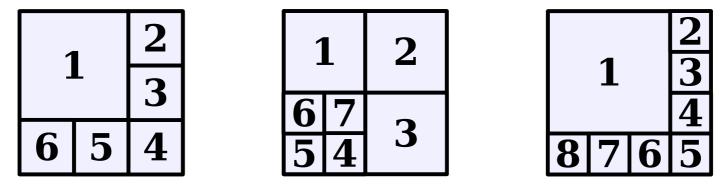
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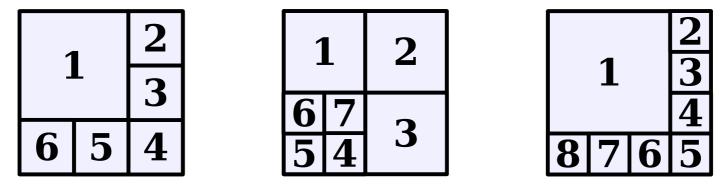
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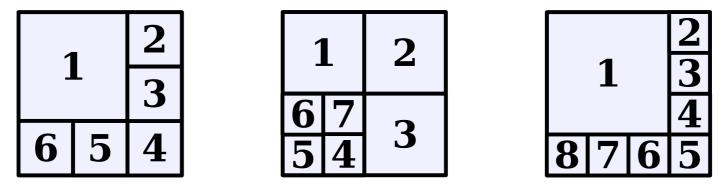
As our base cases, we prove P(6), P(7), and P(8), that a square can be subdivided into 6, 7, and 8 squares. This is shown here:



For the inductive step, assume that for some arbitrary $k \ge 6$ that P(k) is true and that there is a way to subdivide a square into k squares. We prove P(k+3), that there is a way to subdivide a square into k+3 squares. To see this, start by obtaining (via the inductive hypothesis) a subdivision of a square into k squares. Then, choose any of the squares and split it into four equal squares. This removes one of the k squares and adds four more, so there will be a net total of k+3 squares.

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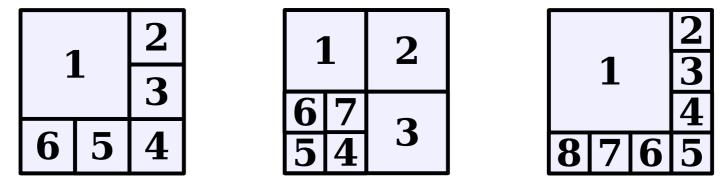
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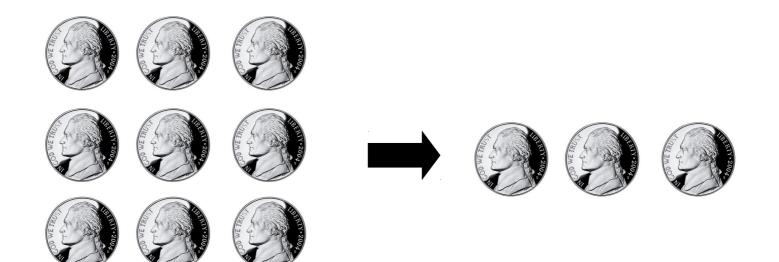
Generalizing Induction

- When doing a proof by induction,
 - feel free to use multiple base cases, and
 - feel free to take steps of sizes other than one.
- If you do, make sure that...
 - ... you actually need all your base cases. Avoid redundant base cases that are already covered by a mix of other base cases and your inductive step.
 - ... you cover all the numbers you need to cover. Trace out your reasoning and make sure all the numbers you need to cover really are covered.
- As with a proof by cases, you don't need to separately prove you've covered all the options. We trust you.

More on Square Subdivisions

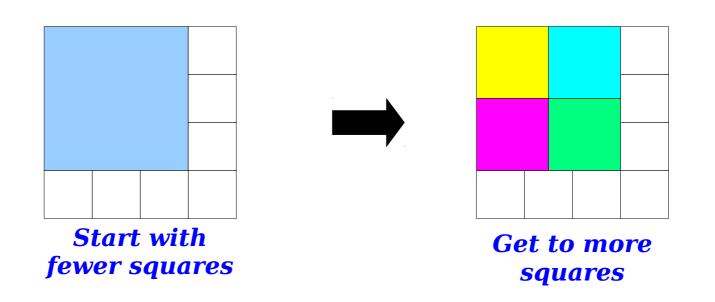
- There are a ton of interesting questions that come up when trying to subdivide a rectangle or square into smaller squares.
- In fact, one of the major players in early graph theory (William Tutte) got his start playing around with these problems.
- Good starting resource: this Numberphile video on <u>Squaring the Square</u>.

An Observation



Start with bigger pile of coins

Get to smaller pile of coins



Following the Rules

- When working with square subdivisions, our predicate looked like this:
 - *P*(*n*) is "there exists a way to subdivide a square into *n* squares."
- When working with the counterfeit coin problem, our predicate looked like this:
 - P(n) is "**for any** group of 3^n coins, you can find the counterfeit in n weighings."
- With squares, the quantifier is \exists . With coins, the first quantifier is \forall .
- This fundamentally changes the "feel" of induction.

Build Up with 3

• In the case of squares, in our inductive step, we prove If

there exists a subdivision into k squares, then

there exists a subdivision into k+3 squares.

- Assuming the antecedent gives us a concrete subdivision into *k* squares.
- Proving the consequent means finding some way to subdivide in to k+3 squares.
- The inductive step goal is to "**build up**:" start with a smaller number of squares, and somehow work out what to do to get a larger number of squares.

Build Down with ∀

• In the counterfeit coin case, in our inductive step, we prove If

for all groups of 3^k coins, you can find the counterfeit in k weighings.

then

for all groups of 3^{k+1} coins, you can find the counterfeit in k+1 weighings.

- Assuming the antecedent means once we find a group of 3^k coins, we know that we can find the counterfeit with k weighings.
- Proving the consequent means picking an arbitrary group of 3^{k+1} coins, then finding the counterfeit with k+1 weighings.
- The inductive step goal is to "build down:" start with a larger group, then find a way to turn it into a smaller group.

Some Notes

- Not all predicates P(n) will have the form outlined here.
 - That's okay! Just use the normal rules for assuming and proving things.
 - Think of these as quick shorthands rather than fundamentally new strategies.
- In all cases, assume P(k) and prove P(k+1).
 - All that changes is what you do to assume P(k) and what you do to prove P(k+1).

Time-Out for Announcements!

Problem Set Five

- Problem Set Four was due at 4:00PM today.
 - You can use a late day to extend the deadline to Saturday at 4:00PM. Remember that you can use at most one late day per problem set.
- Problem Set Five goes out today. It's due next Friday at 4:00PM.
 - Play around with everything we've covered so far, plus a healthy dose of induction and inductive problem-solving.
- Before starting, read our "Guide to Induction" and "Induction Proofwriting Checklist," which cover common and important cases to look for.
- As always, ping us if you have any questions! That's what we're here for.

Back to CS103!

Complete Induction

Let's do the wave, again!

This is kinda like P(0).

If you are the *leftmost* person in your row, stand up right now.

Everyone else: stand up as soon as the person to your left in your row stands up.

This is kinda like $P(k) \rightarrow P(k+1)$.

Everyone, please be seated.

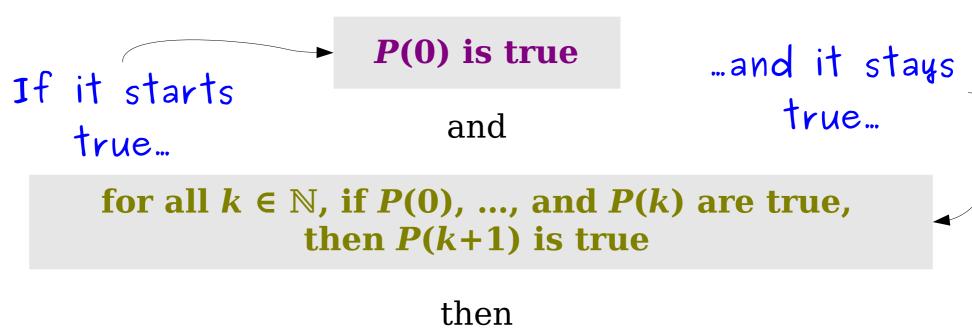
This is kinda like P(0).

If you are the *leftmost* person in your row, stand up right now.

Everyone else: stand up as soon as everyone left of you in your row stands up.

What sort of sorcery is this?

Let P be some predicate. The **principle of complete induction** states that if



 $\forall n \in \mathbb{N}. P(n)$...then it's always true.

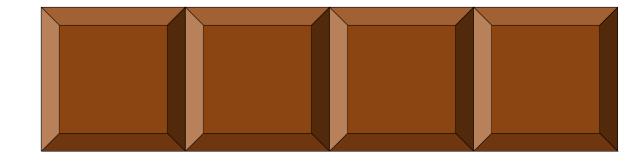
Mathematical Induction

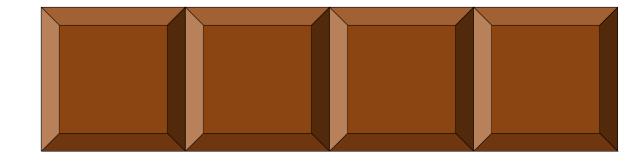
- You can write proofs using the principle of mathematical induction as follows:
 - Define some predicate P(n) to prove by induction on n.
 - Choose and prove a base case (probably, but not always, P(0)).
 - Pick an arbitrary $k \in \mathbb{N}$ and assume that P(k) is true.
 - Prove P(k+1).
 - Conclude that P(n) holds for all $n \in \mathbb{N}$.

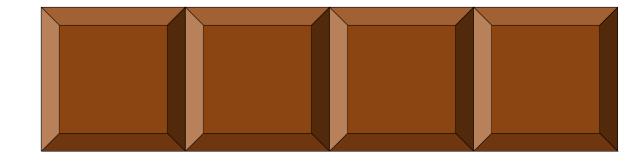
Complete Induction

- You can write proofs using the principle of *complete* induction as follows:
 - Define some predicate P(n) to prove by induction on n.
 - Choose and prove a base case (probably, but not always, P(0)).
 - Pick an arbitrary $k \in \mathbb{N}$ and assume that P(0), P(1), P(2), ..., and P(k) are all true.
 - Prove P(k+1).
 - Conclude that P(n) holds for all $n \in \mathbb{N}$.

An Example: **Eating a Chocolate Bar**

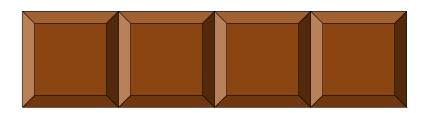




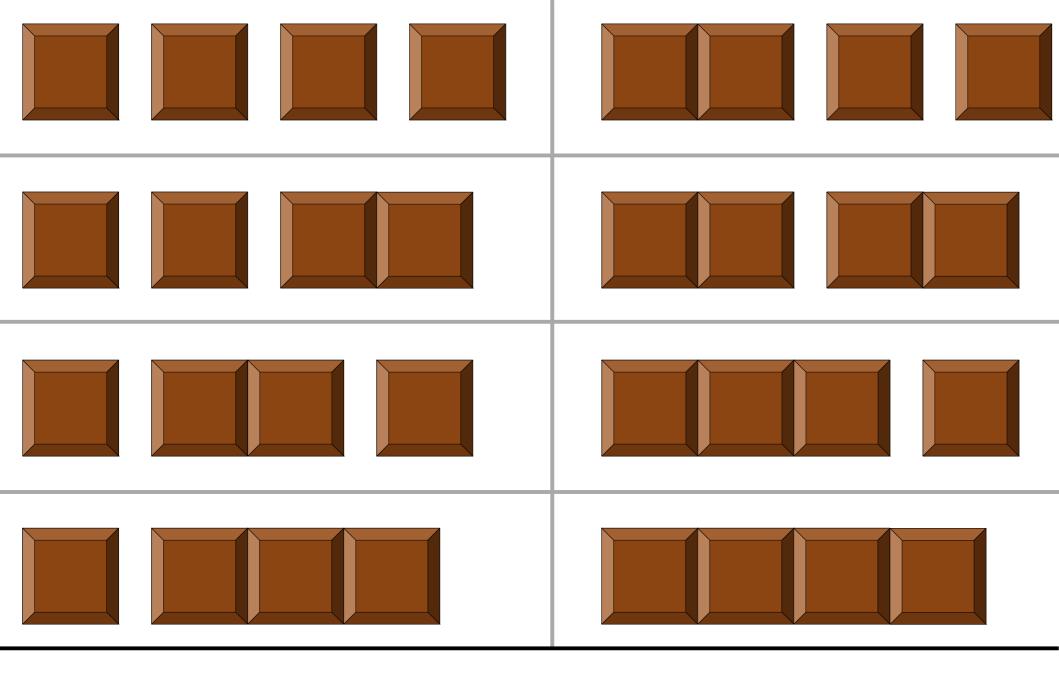


Eating a Chocolate Bar

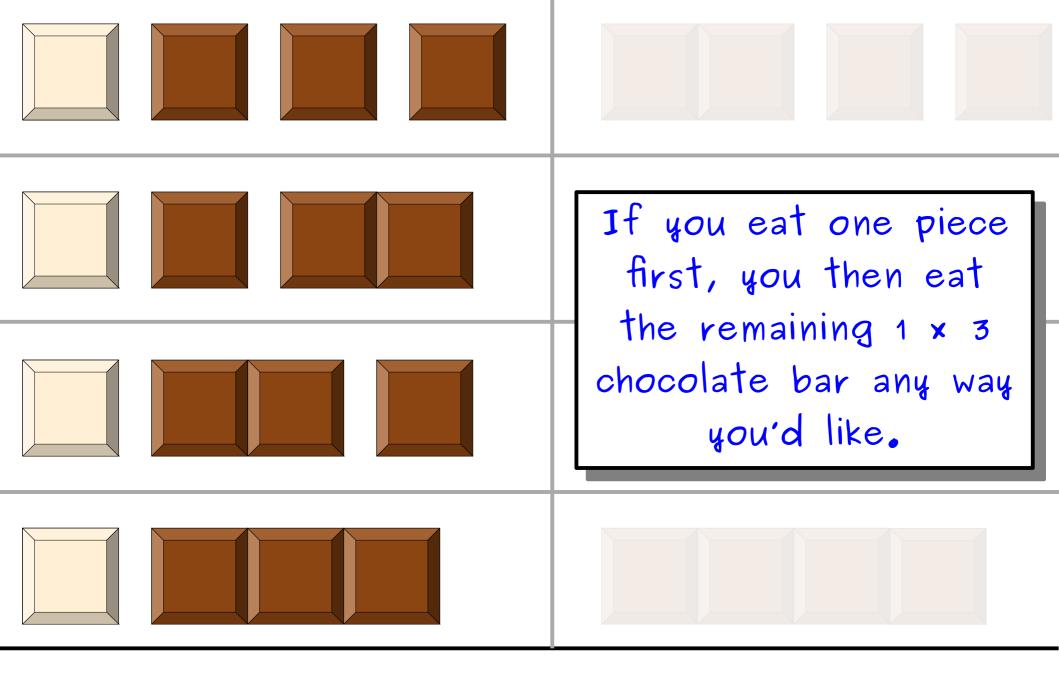
- You have a $1 \times n$ chocolate bar subdivided into 1×1 squares.
- You eat the chocolate bar from left to right by breaking off one or more squares and eating them in one (possibly enormous) bite.
- How many ways can you eat a...
 - 1 × 1 chocolate bar?
 - 1 × 2 chocolate bar?
 - 1 × 3 chocolate bar?
 - 1 × 4 chocolate bar?



Answer at https://pollev.com/cs103



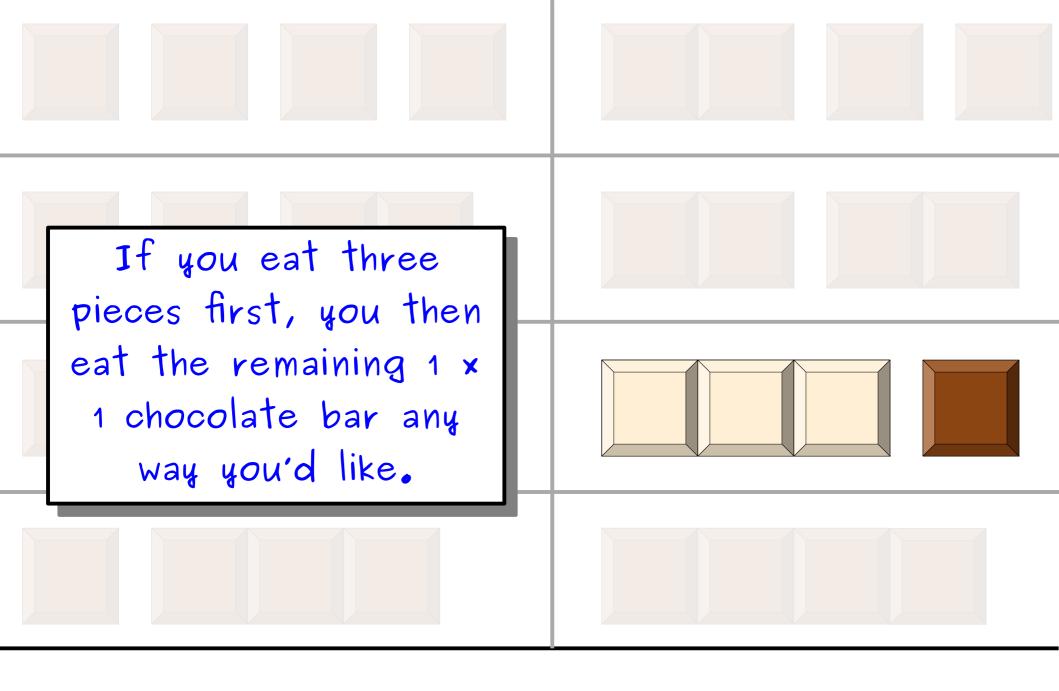
There are eight ways to eat a 1×4 chocolate bar.



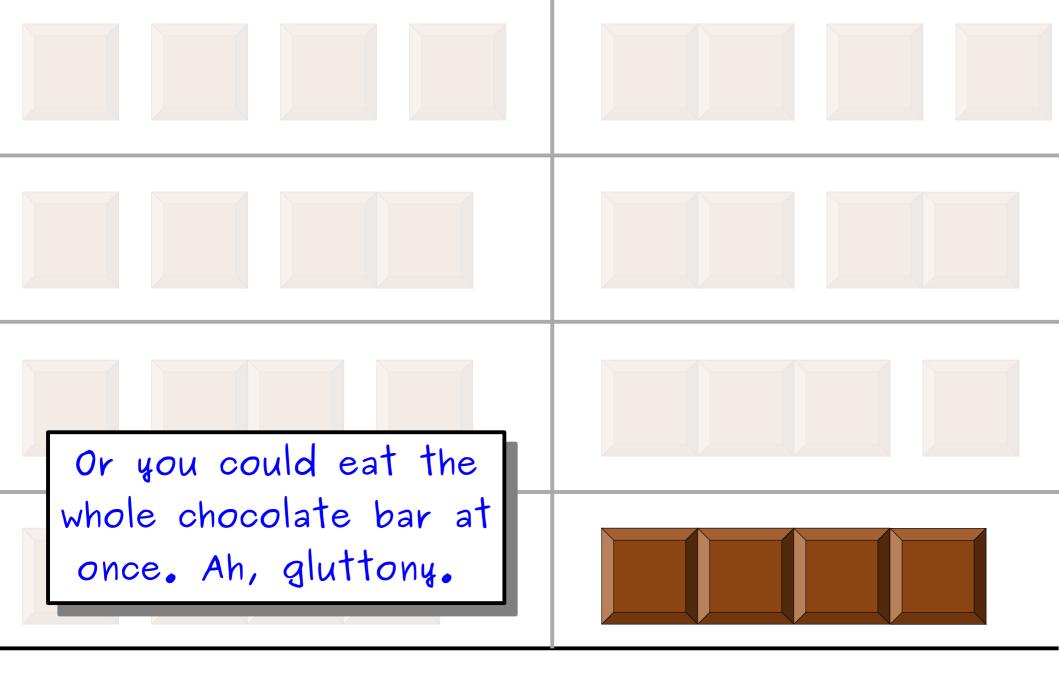
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Eating a Chocolate Bar

- There's...
 - 1 way to eat a 1 × 1 chocolate bar,
 - 2 ways to eat a 1×2 chocolate bar,
 - 4 ways to eat a 1×3 chocolate bar, and
 - 8 ways to eat a 1×4 chocolate bar.
- *Our guess:* There are 2^{n-1} ways to eat a $1 \times n$ chocolate bar for any natural number $n \ge 1$.
- And we think it has something to do with this insight: we eat the bar either by
 - eating the whole thing in one bite, or
 - eating some piece of size k, then eating the remaining n-k pieces however we'd like.
- Let's formalize this!

Proof:

Proof: Let P(n) be "the number of ways to eat a $1 \times n$ chocolate bar from left to right is 2^{n-1} ."

- **Theorem:** For any natural number $n \ge 1$, the number of ways to eat a $1 \times n$ chocolate bar from left to right is 2^{n-1} .
- **Proof:** Let P(n) be "the number of ways to eat a $1 \times n$ chocolate bar from left to right is 2^{n-1} ." We will prove by induction that P(n) holds for all natural numbers $n \ge 1$, from which the theorem follows.

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Summing up this first option, plus all choices of r for the second option, we see that the number of ways to eat the chocolate bar is

$$1 + 2^0 + 2^1 + ... + 2^{k-1}$$

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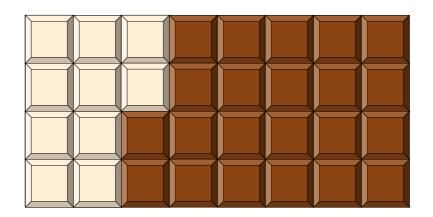
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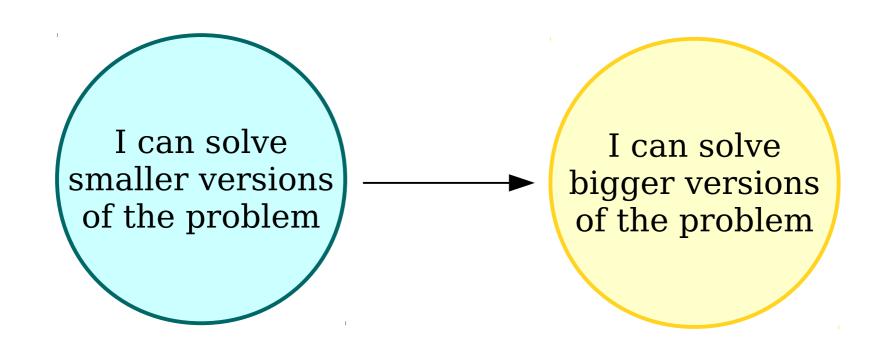
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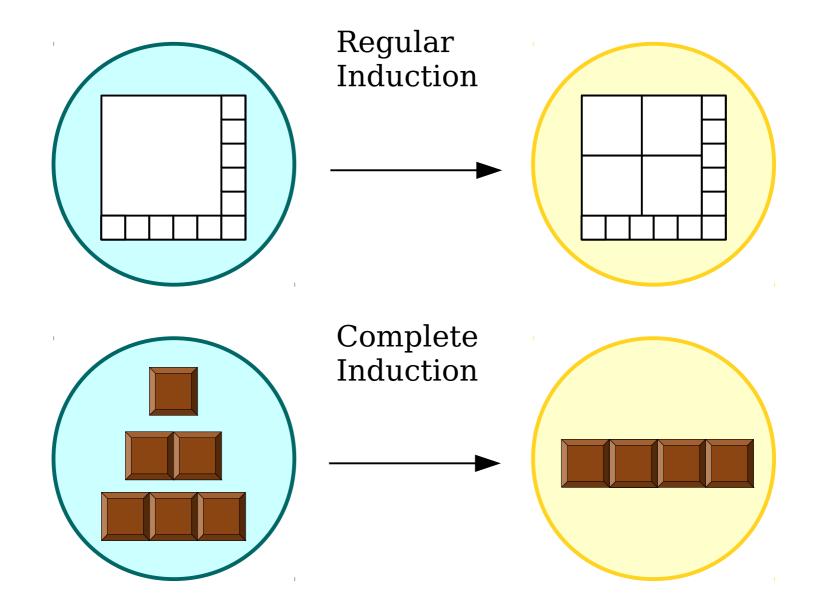
More on Chocolate Bars

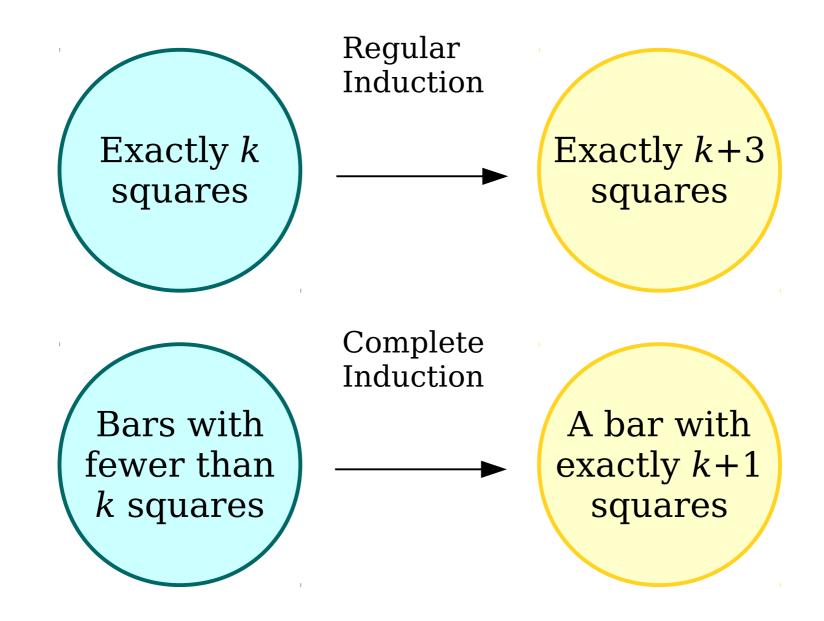
- Imagine you have an $m \times n$ chocolate bar. Whenever you eat a square, you have to eat all squares above it and to the left.
- How many ways are there to eat the chocolate bar?

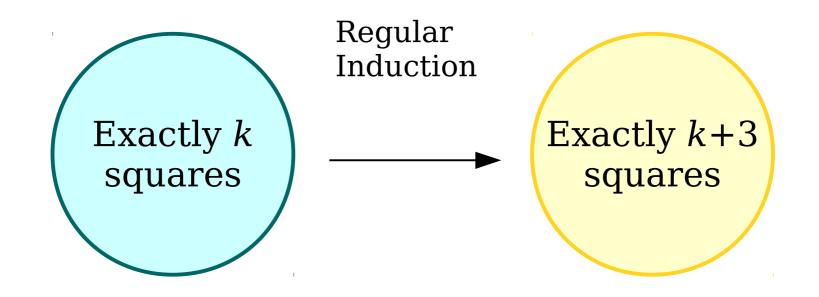


• *Open Problem:* Find a non-recursive exact formula for this number, or give an approximation whose error drops to zero as *m* and *n* tend toward infinity.









Bars with fewer than k squares

Regular induction is great when you know exactly how much smaller your 'smaller' problem instance is.

Complete induction is great when you know things get smaller, but you're not sure by how much.

Exactly k+3 squares

Bars with fewer than k squares

Complete Induction

A bar with exactly k+1 squares

How Not To Induct, Part 2

P(n) = "All groups of n horses always have the same color"

P(0) = "All groups of 0 horses always have the same color"

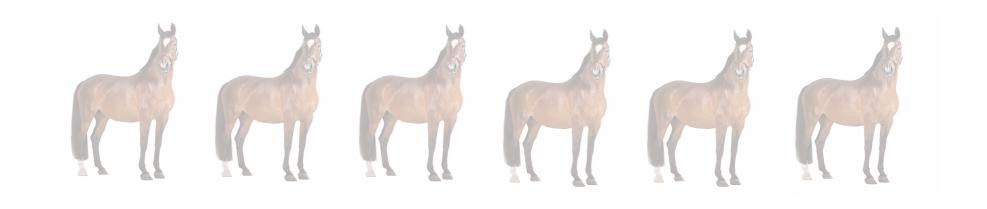
Vacuously true!

Base case: n = 0

Assume P(k) = "All groups of k horses always have the same color"



Prove P(k+1) = "All groups of k+1 horses always have the same color"



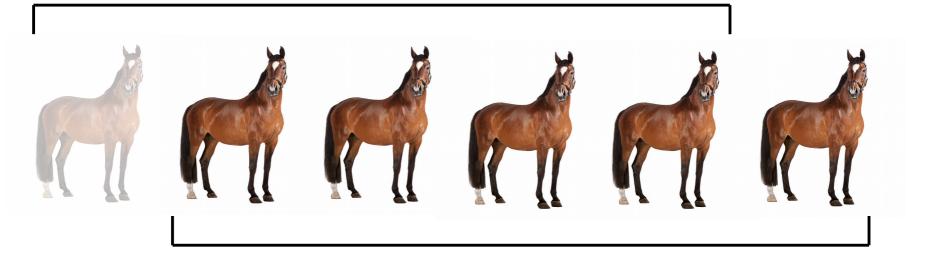
Prove P(k+1) = "All groups of k+1 horses always have the same color"

By P(k), these k horses have the same color



Prove P(k+1) = "All groups of k+1 horses always have the same color"

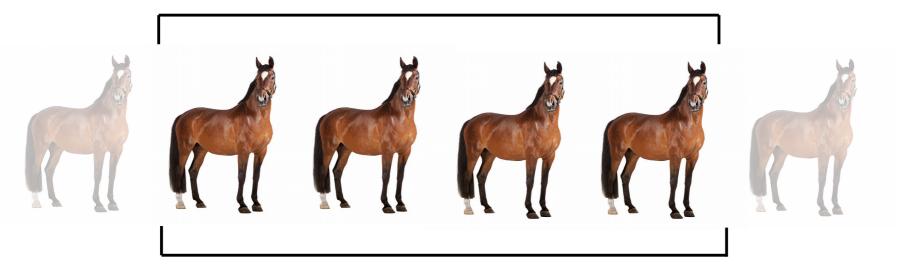
By P(k), these k horses have the same color



By P(k), these k horses have the same color

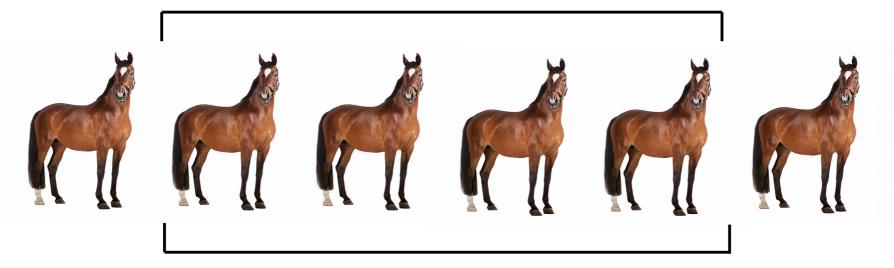
Prove P(k+1) = "All groups of k+1 horses always have the same color"

These horses in the middle were in both sets



Prove P(k+1) = "All groups of k+1 horses always have the same color"

These horses in the middle were in both sets



And we said that both horses on the ends are the same color as these overlapping horses

Prove P(k+1) = "All groups of k+1 horses always have the same color"



So all k+1 horses have the same color!

 \triangle *Incorrect!* \triangle *Proof:* Let P(n) be the statement "all groups of n horses are the same color." We will prove by induction that P(n) holds for all natural numbers n, from which the theorem follows.

As our base case, we prove P(0), that all groups of 0 horses are the same color. This statement is vacuously true because there are no horses.

For the inductive step, assume that for an arbitrary natural number k that P(k) is true and that all groups of k horses are the same color. Now consider a group of k+1 horses. Exclude the last horse and look only at the first k horses. By the inductive hypothesis, these horses are the same color. Next, exclude the first horse and look only at the last k horses. Again we see by the inductive hypothesis that these horses are the same color.

Therefore, the first horse is the same color as the non-excluded horses, who in turn are the same color as the last horse. Hence the first horse excluded, the non-excluded horses, and last horse excluded are all of the same color. Thus P(k+1) holds, completing the induction.

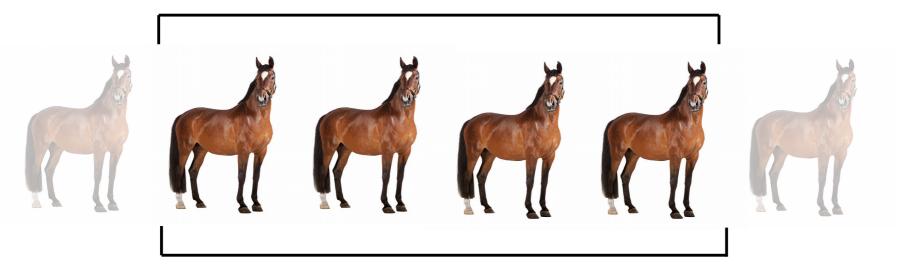
What's wrong with this proof?

Answer at https://pollev.com/cs103

What's going on here?

Prove P(k+1) = "All groups of k+1 horses always have the same color"

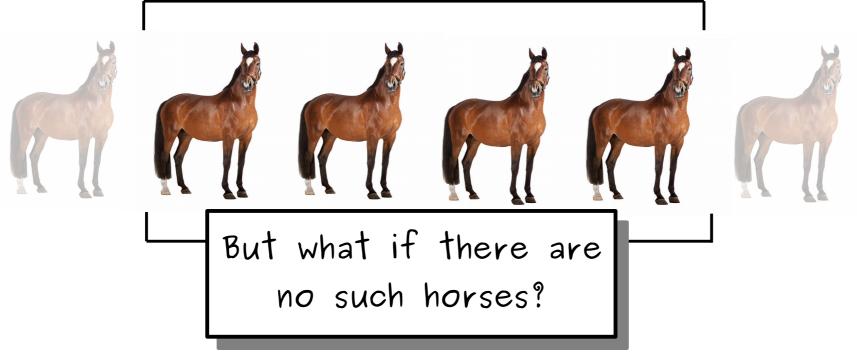
These horses in the middle were in both sets



Inductive hypothesis: n = k+1

Prove P(k+1) = "All groups of k+1 horses always have the same color"

These horses in the middle were in both sets



Inductive hypothesis: n = k+1

P(n) = "All groups of n horses always have the same color"



$$P(1) \rightarrow P(2)$$

P(n) = "All groups of n horses always have the same color"

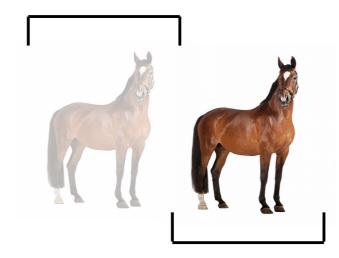
By P(1), this 1 horse has the same color



$$P(1) \rightarrow P(2)$$

P(n) = "All groups of n horses always have the same color"

By P(1), this 1 horse has the same color

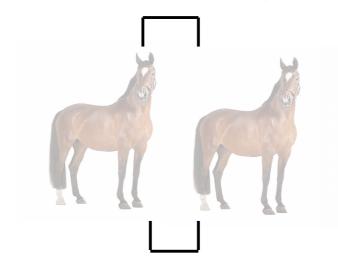


By P(1), this 1 horse has the same color

$$P(1) \rightarrow P(2)$$

P(n) = "All groups of n horses always have the same color"

These horses in the middle (??) were in both sets



$$P(1) \rightarrow P(2)$$

 \triangle *Incorrect!* \triangle *Proof:* Let P(n) be the statement "all groups of n horses are the same color." We will prove by induction that P(n) holds for all natural numbers n, from which the theorem follows.

As our base case, we prove P(0), that all groups of 0 horses are the same color. This statement is vacuously true because there are no

horses.

For the inductive that P(k) is true consider a growth the first k horse same color. Next horses. Again v the same color.

The logic in our inductive step does not allow us to get from P(1) to P(2). Specifically, there are no non-excluded horses that were in both sets.

al number kme color. Now
ad look only at
es are the
the last kse horses are

Therefore, the first horse is the same color as the non-excluded horses, who in turn are the same color as the last horse. Hence the first horse excluded, the non-excluded horses, and last horse excluded are all of the same color. Thus P(k+1) holds, completing the induction.

Non-Issues with this Proof

- "We should have proven additional base cases"
 - A proof by induction only needs a single base case, so the fact that we only have one here is not in itself an issue.
- "We should have used complete induction"
 - Complete induction wouldn't have helped us here either, since our inductive step would still need to use P(0) and P(1) to prove P(2).

Induction Debugging Tips

- Remember that induction requires two parts: the base case and the inductive step.
- If you see an induction proof of a false statement, one of these pieces must be broken.
- Recommendation: try playing the induction out one step at a time (Is the base case true? From the base case, does the reasoning in your inductive step allow you to conclude the next statement? What about the following statement? etc...)

An Important Milestone

Recap: Discrete Mathematics

• The past five weeks have focused exclusively on discrete mathematics:

Induction Functions

Graphs The Pigeonhole Principle

Formal Proofs Mathematical Logic

Set Theory

- These are building blocks we will use throughout the rest of the quarter.
- These are building blocks you will use throughout the rest of your CS career.

Three Questions

- What is something you know now that, at the start of the quarter, you knew you didn't know?
- What is something you know now that, at the start of the quarter, you didn't know that you didn't know?
- What is something you don't know that, at the start of the quarter, you didn't know that you didn't know?

Next Up: Computability Theory

- It's time to switch gears and address the limits of what can be computed.
- We'll explore these questions:
 - How do we model computation itself?
 - What exactly is a computing device?
 - What problems can be solved by computers?
 - What problems can't be solved by computers?
- Get ready to explore the boundaries of what computers could ever be made to do.

Next Time

Formal Language Theory

 How are we going to formally model computation?

• Finite Automata

• A simple but powerful computing device made entirely of math!

• **DFAs**

A fundamental building block in computing.