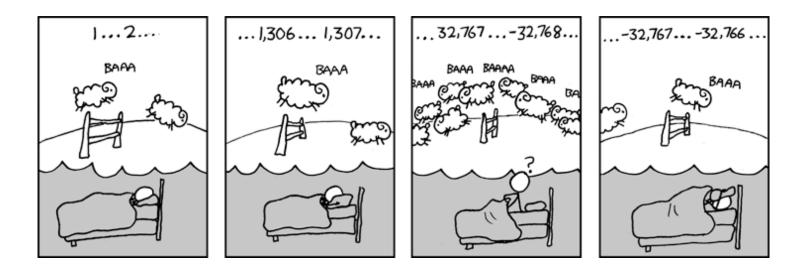
#### **CSE 311:** Foundations of Computing

#### **Topic 5: More Number Theory**



# GCD

#### GCD(a, b):

Largest integer d such that  $d \mid a$  and  $d \mid b$ 

- GCD(100, 125) =
- GCD(17, 49) =
- GCD(11, 66) =
- GCD(13, 0) =
- GCD(180, 252) =

*d* is GCD iff  $(d \mid a) \land (d \mid b) \land \forall x (((x \mid a) \land (x \mid b)) \rightarrow (x \leq d))$ 

Let *a* and *b* be positive integers. We have gcd(*a*, *b*) = gcd(*b*, *a* mod *b*)

#### **Proof Idea:**

We will show that every number dividing a and b also divides b and  $a \mod b$ . I.e., d|a and d|b iff d|b and  $d|(a \mod b)$ .

Hence, their set of common divisors are the same, which means that their greatest common divisor is the same.

Let a and b be positive integers. We have  $gcd(a, b) = gcd(b, a \mod b)$ 

#### **Proof:**

By the Division Theorem,  $a = qb + (a \mod b)$  for some integer  $q = a \operatorname{div} b$ .

Suppose  $d \mid b$  and  $d \mid (a \mod b)$ . Then b = md and  $(a \mod b) = nd$  for some integers m and n. Therefore  $a = qb + (a \mod b) = qmd + nd = (qm + n)d$ . So  $d \mid a$ . Suppose  $d \mid a$  and  $d \mid b$ . Then a = kd and b = jd for some integers k and j.

Therefore  $(a \mod b) = a - qb = kd - qjd = (k - qj)d$ . So,  $d \mid (a \mod b)$  also.

Since they have the same common divisors,  $gcd(a, b) = gcd(b, a \mod b)$ .

Another simple GCD fact

Let a be a positive integer. We have gcd(a, 0) = a.

```
gcd(a, b) = gcd(b, a \mod b) gcd(a, 0) = a
```

```
int gcd(int a, int b){ /* Assumes: a >= b, b >= 0 */
    if (b == 0) {
        return a;
    } else {
        return gcd(b, a % b);
    }
}
```

Note: gcd(b, a) = gcd(a, b)

Repeatedly use  $gcd(a, b) = gcd(b, a \mod b)$  to reduce numbers until you get gcd(g, 0) = g.

gcd(660,126) =

Repeatedly use  $gcd(a, b) = gcd(b, a \mod b)$  to reduce numbers until you get gcd(g, 0) = g.

$$gcd(660,126) = gcd(126, 660 \mod 126) = gcd(126, 30)$$
  
=  $gcd(30, 126 \mod 30) = gcd(30, 6)$   
=  $gcd(6, 30 \mod 6) = gcd(6, 0)$   
= 6

If *a* and *b* are positive integers, then there exist integers *s* and *t* such that gcd(a,b) = sa + tb.

 $(a > 0 \land b > 0) \rightarrow \exists s \exists t (gcd(a,b) = sa + tb)$ 

 $\forall a \forall b ((a > 0 \land b > 0) \rightarrow \exists s \exists t (gcd(a,b) = sa + tb))$ 

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a,b) = sa + tb

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a, b) = sa + tb

Step 1 (Compute GCD & Keep Tableau Information):

abamodbrbr $gcd(35, 27) = gcd(27, 35 \mod 27) = gcd(27, 8)$ gcd(27, 8)a = q \* b + r35 = 1 \* 27 + 8

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a,b) = sa + tb

Step 1 (Compute GCD & Keep Tableau Information):

a b b a mod b = r b r  $gcd(35, 27) = gcd(27, 35 \mod 27) = gcd(27, 8)$   $= gcd(8, 27 \mod 8) = gcd(8, 3)$   $= gcd(3, 8 \mod 3) = gcd(3, 2)$   $= gcd(2, 3 \mod 2) = gcd(2, 1)$   $= gcd(1, 2 \mod 1) = gcd(1, 0)$ a = q \* b + r 35 = 1 \* 27 + 8 27 = 3 \* 8 + 3 8 = 2 \* 3 + 23 = 1 \* 2 + 1

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a,b) = sa + tb

**Step 2** (Solve the equations for r):

$$r = a - q * b$$
  
8 = 35 - 1 \* 27

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a,b) = sa + tb

**Step 2** (Solve the equations for r):

a = q \* b + r  

$$35 = 1 * 27 + 8$$
  
 $27 = 3 * 8 + 3$   
 $8 = 2 * 3 + 2$   
 $3 = 1 * 2 + 1$ 

$$r = a - q * b$$
  

$$8 = 35 - 1 * 27$$
  

$$3 = 27 - 3 * 8$$
  

$$2 = 8 - 2 * 3$$
  

$$1 = 3 - 1 * 2$$

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a, b) = sa + tb

**Step 3 (Backward Substitute Equations):** 

$$8 = 35 - 1 * 27$$

$$3 = 27 - 3 * 8$$

$$2 = 8 - 2 * 3$$

$$(1) = 3 - 1 * 2$$

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a, b) = sa + tb

Step 3 (Backward Substitute Equations):

Plug in the def of 2

$$8 = 35 - 1 * 27$$

$$1 = 3 - 1 * (8 - 2 * 3)$$

$$= 3 - 8 + 2 * 3$$

$$= (-1) * 8 + 3 * 3$$

$$3's \text{ and } 8's$$

$$1 = 3 - 1 * 2$$

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a, b) = sa + tb

**Step 3 (Backward Substitute Equations):** 

Plug in the def of 2

• Can use Euclid's Algorithm to find *s*, *t* such that

gcd(a, b) = sa + tb

**Step 3 (Backward Substitute Equations):** 

Plug in the def of 2

#### Multiplicative inverse mod *m*

# Let $0 \le a, b < m$ . Then, b is the multiplicative inverse of a (modulo m) iff $ab \equiv_m 1$ .

х	0	1	2	3	4	5	6
0	0	0	0	0	0	0	0
1	0	1	2	3	4	5	6
2	0	2	4	6	1	3	5
3	0	3	6	2	5	1	4
4	0	4	1	5	2	6	3
5	0	5	3	1	6	4	2
6	0	6	5	4	3	2	1

x	0	1	2	3	4	5	6	7	8	9
0	0	0	0	0	0	0	0	0	0	0
1	0	1	2	3	4	5	6	7	8	9
2	0	2	4	6	8	0	2	4	6	8
3	0	3	6	9	2	5	8	1	4	7
4	0	4	8	2	6	0	4	8	2	6
5	0	5	0	5	0	5	0	5	0	5
6	0	6	2	8	4	0	6	2	8	4
7	0	7	4	1	8	5	2	9	6	3
8	0	8	6	4	2	0	8	6	4	2
9	0	9	8	7	6	5	4	3	2	1

mod 7

mod 10

Suppose gcd(a, m) = 1

By Bézout's Theorem, there exist integers s and tsuch that sa + tm = 1.

s is the multiplicative inverse of a (modulo m):

 $1 \equiv_m sa \text{ since } m \mid 1 - sa \text{ (since } 1 - sa = tm)$ 

So... we can compute multiplicative inverses with the extended Euclidean algorithm

These inverses let us solve modular equations...

**Solve:**  $7x \equiv_{26} 3$  Find multiplicative inverse of 7 modulo 26

Solve:  $7x \equiv_{26} 3$  Find multiplicative inverse of 7 modulo 26 gcd(26,7) = gcd(7,5) = gcd(5,2) = gcd(2,1) = 1 26 = 3 \* 7 + 5 7 = 1 \* 5 + 25 = 2 \* 2 + 1 Solve:  $7x \equiv_{26} 3$  Find multiplicative inverse of 7 modulo 26 gcd(26,7) = gcd(7,5) = gcd(5,2) = gcd(2,1) = 1 26 = 3 \* 7 + 5 5 = 26 - 3 \* 7 7 = 1 \* 5 + 2 2 = 7 - 1 \* 55 = 2 \* 2 + 1 1 = 5 - 2 \* 2

**Solve:**  $7x \equiv_{26} 3$  Find multiplicative inverse of 7 modulo 26 gcd(26,7) = gcd(7,5) = gcd(5,2) = gcd(2,1) = 126 = 3 \* 7 + 5 5 = 26 - 3 \* 77 = 1 \* 5 + 2 2 = 7 - 1 \* 55 = 2 \* 2 + 1 1 = 5 - 2 \* 21 = 5 - 2 \* (7 - 1 \* 5)= (-2) \* 7 + 3 \* 5= (-2) \* 7 + 3 \* (26 - 3 \* 7)= (-11) \* 7 + 3 \* 26

**Solve:**  $7x \equiv_{26} 3$  Find multiplicative inverse of 7 modulo 26 gcd(26,7) = gcd(7,5) = gcd(5,2) = gcd(2,1) = 126 = 3 \* 7 + 5 5 = 26 - 3 \* 77 = 1 \* 5 + 2 2 = 7 - 1 \* 55 = 2 \* 2 + 1 1 = 5 - 2 \* 21 = 5 - 2 \* (7 - 1 \* 5)= (-2) \* 7 + 3 \* 5= (-2) \* 7 + 3 \* (26 - 3 \* 7)= (-11) \* 7 + 3 \* 26Now  $(-11) \mod 26 = 15$ . "<u>the</u>" multiplicative inverse (-11 is also "a" multiplicative inverse) Solve:  $7x \equiv_{26} 3$ 

Find multiplicative inverse of 7 modulo 26... it's 15.

Multiplying both sides by 15 gives

 $15 \cdot 7x \equiv_{26} 15 \cdot 3$ 

Simplify on both sides to get

 $x \equiv_{26} 15 \cdot 7x \equiv_{26} 15 \cdot 3 \equiv_{26} 19$ 

So, <u>all</u> solutions of this congruence are numbers of the form x = 19 + 26k for some  $k \in \mathbb{Z}$ .

Adding to both sides easily reversible:

$$x \equiv_{m} y$$

$$x + c \equiv_{m} y + c$$

The same is not true of multiplication...

unless we have a multiplicative inverse  $cd \equiv_m 1$ 

$$\times d \bigwedge^{x} x \equiv_{m} y \xrightarrow{\times c} cx \equiv_{m} cy$$

 $7x \equiv_{26} 3 \implies 15 \cdot 7x \equiv_{26} 15 \cdot 3$ multiply both sides by 15  $\implies x \equiv_{26} 19$ since  $15 \cdot 7 \equiv_{26} 1$  and  $15 \cdot 3 \equiv_{26} 19$ 

 $x \equiv_{26} 19 \Rightarrow 7x \equiv_{26} 7 \cdot 19$ 

multiply both sides by 7

 $\Rightarrow$  7x  $\equiv_{26}$  3

since  $7 \cdot 19 \equiv_{26} 3$ 

Solve:  $7x \equiv_{26} 3$ 

Step 1. Find multiplicative inverse of 7 modulo 26

1 = ... = (-11) \* 7 + 3 \* 26

Since  $(-11) \mod 26 = 15$ , the inverse of 7 is 15.

#### **Step 2.** Multiply both sides and simplify

Multiplying by 15, we get  $x \equiv_{26} 15 \cdot 7x \equiv_{26} 15 \cdot 3 \equiv_{26} 19$ .

#### Step 3. State the full set of solutions

So, the solutions are 19 + 26k for any  $k \in \mathbb{Z}$ (must be of the form a + mk for all  $k \in \mathbb{Z}$  with  $0 \le a < m$ ) Solve:  $7(x-3) \equiv_{26} 8 + 2x$ 

Modular equation like  $Ax \equiv_{26} B$  for some *A* and *B* is in "standard form".

solve by multiplying both sides by inverse of A

What about equation not in standard form?

Solve:  $7(x-3) \equiv_{26} 8 + 2x$ 

Transform into standard form by adding to both sides

$$7(x-3) \equiv_{26} 8 + 2x$$

$$7(x-3) + 21 \equiv_{26} 8 + 2x + 21 \quad \text{add } 21 \text{ to both sides}$$

$$7x \equiv_{26} 3 + 2x \quad \text{simplify}$$

$$7x - 2x \equiv_{26} 3 + 2x - 2x \quad \text{add } -2x \text{ to both sides}$$

$$5x \equiv_{26} 3 \quad \text{simplify}$$

## Induction

Method for proving statements about all natural numbers

- A new logical inference rule!
  - It only applies over the natural numbers
  - The idea is to **use** the special structure of the naturals to prove things more easily

- Particularly useful for reasoning about programs!
for (int i=0; i < n; n++) { ... }</pre>

• Show P(i) holds after i times through the loop

**Prove**  $\forall k ((a \equiv_m b) \rightarrow (a^k \equiv_m b^k))$ 

#### Let *k* be an arbitrary *non-negative* integer. Suppose that $a \equiv_m b$ .

We know  $((a \equiv_m b) \land (a \equiv_m b)) \rightarrow (a^2 \equiv_m b^2)$  by multiplying congruences. So, applying this repeatedly, we have:

$$\begin{array}{l} ((a \equiv_m b) \land (a \equiv_m b)) \rightarrow (a^2 \equiv_m b^2) \\ ((a^2 \equiv_m b^2) \land (a \equiv_m b)) \rightarrow (a^3 \equiv_m b^3) \end{array}$$

$$\left( (a^{k-1} \equiv_m b^{k-1}) \land (a \equiv_m b) \right) \to (a^k \equiv_m b^k)$$

The "..." is a problem! We don't have a proof rule that allows us to say "do this over and over".

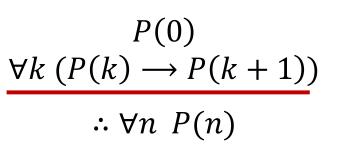
#### But there is such a rule for the natural numbers!

Domain: Natural Numbers

$$P(0) \quad \forall k \ (P(k) \longrightarrow P(k+1))$$
$$\therefore \forall n \ P(n)$$

### **Induction Is A Rule of Inference**

**Domain: Natural Numbers** 



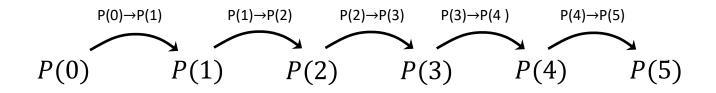
How do the givens prove P(3)?

### **Induction Is A Rule of Inference**

**Domain: Natural Numbers** 

$$P(0)$$
  
$$\forall k \ (P(k) \rightarrow P(k+1))$$
  
$$\therefore \forall n \ P(n)$$

#### How do the givens prove P(5)?



First, we have P(0). Since P(n)  $\rightarrow$  P(n+1) for all n, we have P(0)  $\rightarrow$  P(1). Since P(0) is true and P(0)  $\rightarrow$  P(1), by Modus Ponens, P(1) is true. Since P(n)  $\rightarrow$  P(n+1) for all n, we have P(1)  $\rightarrow$  P(2). Since P(1) is true and P(1)  $\rightarrow$  P(2), by Modus Ponens, P(2) is true.

 $P(0) \quad \forall k \ (P(k) \rightarrow P(k+1))$  $\therefore \forall n \ P(n)$ 

$$P(0) \quad \forall k \ (P(k) \longrightarrow P(k+1))$$
$$\therefore \forall n \ P(n)$$

1. P(0)

2.  $\forall k (P(k) \rightarrow P(k+1))$ 3.  $\forall n P(n)$ 

?? Induction: 1, 2

$$P(0) \quad \forall k \ (P(k) \longrightarrow P(k+1))$$
$$\therefore \forall n \ P(n)$$

1. P(0)Let k be an arbitrary integer  $\ge 0$ 

2.1 P(k) 
$$\rightarrow$$
 P(k+1)  
2.  $\forall k (P(k) \rightarrow P(k+1))$   
3.  $\forall n P(n)$ 

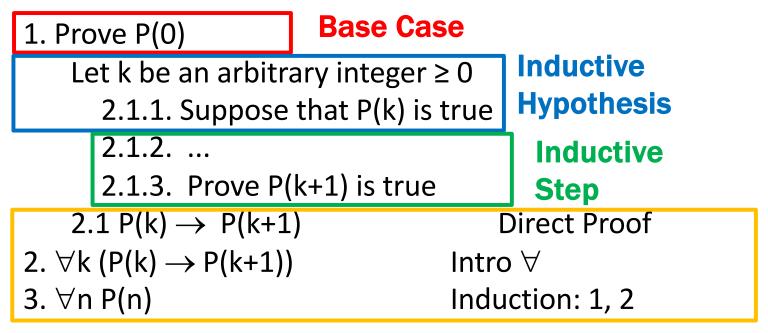
?? Intro  $\forall$ Induction: 1, 2

$$P(0) \quad \forall k \ (P(k) \longrightarrow P(k+1))$$
$$\therefore \forall n \ P(n)$$

```
1. P(0)Let k be an arbitrary integer \geq 0Assumption2.1.1. P(k)Assumption2.1.2. ...2.1.3. P(k+1)2.1 P(k) \rightarrow P(k+1)Direct Proof2. \forall k (P(k) \rightarrow P(k+1))Intro \forall3. \forall n P(n)Induction: 1, 2
```

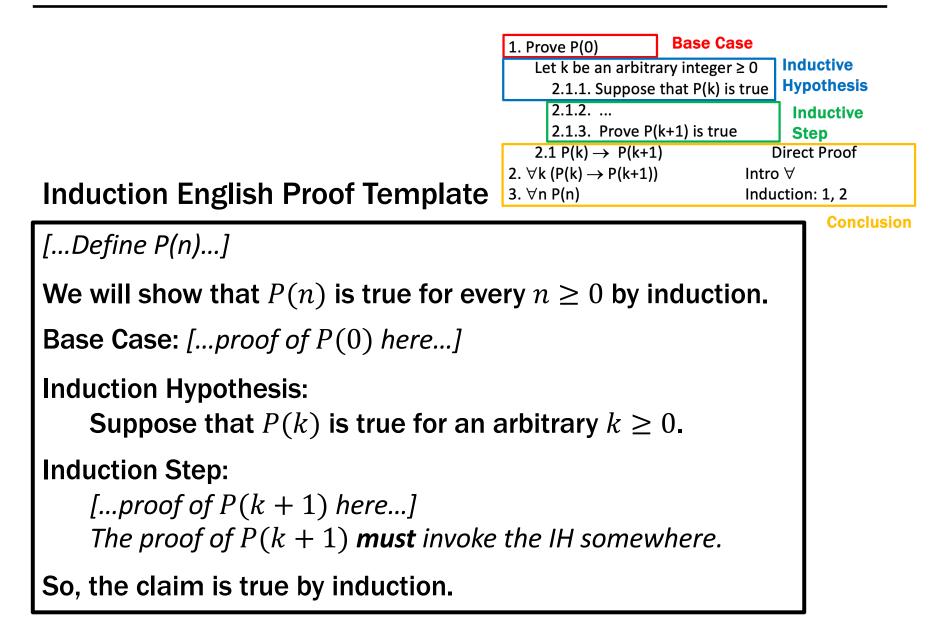
$$P(0) \quad \forall k \ (P(k) \longrightarrow P(k+1))$$

$$\therefore \forall n \ P(n)$$



Conclusion

## **Translating to an English Proof**



## **Proof:**

#### **Basic induction template**

- **1.** "Let P(n) be.... We will show that P(n) is true for every  $n \ge 0$  by Induction."
- **2.** "Base Case:" Prove P(0)
- **3. "Inductive Hypothesis:**

Suppose P(k) is true for an arbitrary integer  $k \ge 0$ "

**4.** "Inductive Step:" Prove that P(k + 1) is true.

Use the goal to figure out what you need.

Make sure you are using I.H. and point out where you are using it. (Don't assume P(k + 1) !!)

5. "Conclusion: Result follows by induction"

- 1 = 1 • 1 + 2 = 3 • 1 + 2 + 4 = 7
- 1 + 2 + 4 = 7
- 1 + 2 + 4 + 8 = 15
- 1 + 2 + 4 + 8 + 16 = 31

It sure looks like this sum is  $2^{n+1} - 1$ 

How can we prove it?

We could prove it for n = 1, n = 2, n = 3, ... but that would literally take forever.

Good that we have induction!

**1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} - 1$ ". We will show P(n) is true for all natural numbers by induction.

- **1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} 1$ ". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0):  $2^0 = 1 = 2 1 = 2^{0+1} 1$  so P(0) is true.

- **1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} 1$ ". We will show P(n) is true for all natural numbers by induction.
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- **3.** Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ , i.e., that  $2^0 + 2^1 + ... + 2^k = 2^{k+1} 1$ .

- **1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} 1$ ". We will show P(n) is true for all natural numbers by induction.
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- 4. Induction Step:

**Goal:** Show P(k+1), i.e. show  $2^0 + 2^1 + ... + 2^k + 2^{k+1} = 2^{k+2} - 1$ 

- **1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} 1$ ". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0):  $2^0 = 1 = 2 1 = 2^{0+1} 1$  so P(0) is true.
- **3.** Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ , i.e., that  $2^0 + 2^1 + ... + 2^k = 2^{k+1} 1$ .
- 4. Induction Step:

 $2^0 + 2^1 + \dots + 2^k = 2^{k+1} - 1$  by IH

Adding  $2^{k+1}$  to both sides, we get:

 $2^{0} + 2^{1} + ... + 2^{k} + 2^{k+1} = 2^{k+1} + 2^{k+1} - 1$ Note that  $2^{k+1} + 2^{k+1} = 2(2^{k+1}) = 2^{k+2}$ . So, we have  $2^{0} + 2^{1} + ... + 2^{k} + 2^{k+1} = 2^{k+2} - 1$ , which is exactly P(k+1).

- **1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} 1$ ". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0):  $2^0 = 1 = 2 1 = 2^{0+1} 1$  so P(0) is true.
- **3.** Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ , i.e., that  $2^0 + 2^1 + ... + 2^k = 2^{k+1} 1$ .
- 4. Induction Step:

We can calculate

$$2^{0} + 2^{1} + \dots + 2^{k} + 2^{k+1} = (2^{0} + 2^{1} + \dots + 2^{k}) + 2^{k+1}$$
  
=  $(2^{k+1} - 1) + 2^{k+1}$  by the IH  
=  $2(2^{k+1}) - 1$   
=  $2^{k+2} - 1$ ,

which is exactly P(k+1).

Alternative way of writing the inductive step

- **1.** Let P(n) be " $2^0 + 2^1 + ... + 2^n = 2^{n+1} 1$ ". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0):  $2^0 = 1 = 2 1 = 2^{0+1} 1$  so P(0) is true.
- **3.** Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ , i.e., that  $2^0 + 2^1 + ... + 2^k = 2^{k+1} 1$ .
- 4. Induction Step:

We can calculate

$$2^{0} + 2^{1} + \dots + 2^{k} + 2^{k+1} = (2^{0} + 2^{1} + \dots + 2^{k}) + 2^{k+1}$$
  
=  $(2^{k+1} - 1) + 2^{k+1}$  by the IH  
=  $2(2^{k+1}) - 1$   
=  $2^{k+2} - 1$ ,

which is exactly P(k+1).

**5.** Thus P(n) is true for all  $n \ge 0$ , by induction.

# Summation Notation $\sum_{i=0}^{n} i = 0 + 1 + 2 + 3 + ... + n$

**1.** Let P(n) be "0 + 1 + 2 + ... + n = n(n+1)/2". We will show P(n) is true for all natural numbers by induction.

# Summation Notation $\sum_{i=0}^{n} i = 0 + 1 + 2 + 3 + ... + n$

- **1.** Let P(n) be "0 + 1 + 2 + ... + n = n(n+1)/2". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0): 0 = 0(0+1)/2. Therefore P(0) is true.

- **1.** Let P(n) be "0 + 1 + 2 + ... + n = n(n+1)/2". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0): 0 = 0(0+1)/2. Therefore P(0) is true.
- 3. Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ . I.e., suppose  $1 + 2 + ... + k \neq k(k+1)/2$

"some" or "an" not <u>any</u>!

- **1.** Let P(n) be "0 + 1 + 2 + ... + n = n(n+1)/2". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0): 0 = 0(0+1)/2. Therefore P(0) is true.
- **3.** Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ . I.e., suppose 1 + 2 + ... + k = k(k+1)/2
- 4. Induction Step:

Goal: Show P(k+1), i.e. show 1 + 2 + ... + k+ (k+1) = (k+1)(k+2)/2

- **1.** Let P(n) be "0 + 1 + 2 + ... + n = n(n+1)/2". We will show P(n) is true for all natural numbers by induction.
- **2.** Base Case (n=0): 0 = 0(0+1)/2. Therefore P(0) is true.
- **3.** Induction Hypothesis: Suppose that P(k) is true for some arbitrary integer  $k \ge 0$ . I.e., suppose 1 + 2 + ... + k = k(k+1)/2
- 4. Induction Step:

$$1 + 2 + ... + k + (k+1) = (1 + 2 + ... + k) + (k+1)$$
  
= k(k+1)/2 + (k+1) by IH  
= (k+1)(k/2 + 1)  
= (k+1)(k+2)/2

So, we have shown 1 + 2 + ... + k + (k+1) = (k+1)(k+2)/2, which is exactly P(k+1).

**5.** Thus P(n) is true for all  $n \in \mathbb{N}$ , by induction.

- What if we want to prove that P(n) is true for all integers  $n \ge b$  for some integer b?
- Define predicate Q(k) = P(k + b) for all k. – Then  $\forall n Q(n) \equiv \forall n \ge b P(n)$
- Ordinary induction for *Q*:
  - **Prove**  $Q(0) \equiv P(b)$
  - Prove

 $\forall k \left( Q(k) \longrightarrow Q(k+1) \right) \equiv \forall k \ge b \left( P(k) \longrightarrow P(k+1) \right)$ 

**Template for induction from a different base case** 

- **1.** "Let P(n) be.... We will show that P(n) is true for all integers  $n \ge b$  by induction."
- **2.** "Base Case:" Prove  $P(\mathbf{b})$
- **3. "Inductive Hypothesis:**

Assume P(k) is true for an arbitrary integer  $k \ge b$ "

**4.** "Inductive Step:" Prove that P(k + 1) is true:

Use the goal to figure out what you need.

Make sure you are using I.H. and point out where you are using it. (Don't assume P(k + 1) !!)

**5.** "Conclusion: P(n) is true for all integers  $n \ge b$ "

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- **1.** Let P(n) be " $3^n \ge n^2+3$ ". We will show P(n) is true for all integers  $n \ge 2$  by induction.
- **2.** Base Case (n=2):  $3^2 = 9 \ge 7 = 4+3 = 2^2+3$  so P(2) is true.
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- 4. Inductive Step:

We can see that

 $3^{k+1} = 3(3^k)$   $\ge 3(k^2+3)$  by the IH  $= 3k^2+9$   $= k^2+2k^2+9$  $\ge k^2+2k+4 = (k+1)^2+3$  since  $k \ge 1$ .

Therefore P(k+1) is true.

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We can see that

```
3^{k+1} = 3(3^k)

\ge 3(k^2+3) by the IH

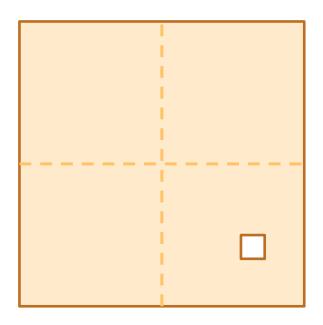
= k^2+2k^2+9

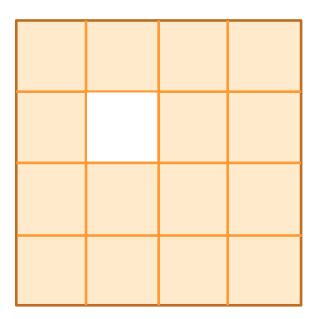
\ge k^2+2k+4 = (k+1)^2+3 since k \ge 1.
```

Therefore P(k+1) is true.

**5.** Thus P(n) is true for all integers  $n \ge 2$ , by induction.

• Prove that a  $2^n \times 2^n$  checkerboard with one square removed can be tiled with:



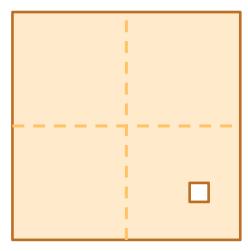


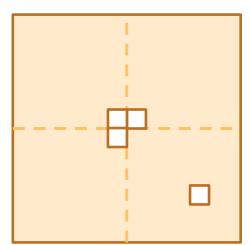
**1.** Let P(n) be any  $2^n \times 2^n$  checkerboard with one square removed can be tiled with  $\square$ . We prove P(n) for all  $n \ge 1$  by induction on n.

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- **2.** Base Case: n=1
- 3. Inductive Hypothesis: Assume P(k) for some arbitrary integer  $k \ge 1$
- 4. Inductive Step: Prove P(k+1)

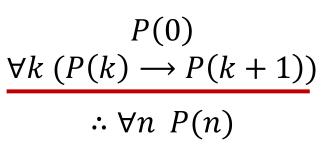




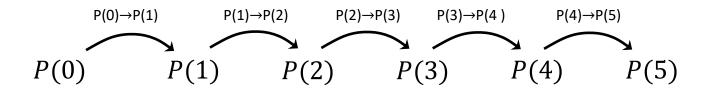
Apply IH to each quadrant then fill with extra tile.

## **Recall: Induction Rule of Inference**

**Domain: Natural Numbers** 





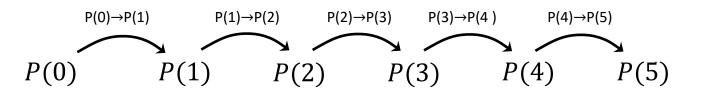


# **Recall: Induction Rule of Inference**



$$P(0)$$
  
$$\forall k \ (P(k) \rightarrow P(k+1))$$
  
$$\therefore \forall n \ P(n)$$

#### How do the givens prove P(5)?



We made it harder than we needed to ...

When we proved P(2) we knew BOTH P(0) and P(1)When we proved P(3) we knew P(0) and P(1) and P(2)When we proved P(4) we knew P(0), P(1), P(2), P(3)etc.

That's the essence of the idea of Strong Induction.

$$P(0) \quad \forall k \left( \forall j \left( 0 \le j \le k \to P(j) \right) \to P(k+1) \right)$$
$$\therefore \forall n P(n)$$

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Strong induction for  ${\it P}$  follows from ordinary induction for  ${\it Q}$  where

$$Q(k) ::= \forall j \left( 0 \le j \le k \to P(j) \right)$$

Note that Q(0) = P(0) and  $Q(k + 1) \equiv Q(k) \land P(k + 1)$ and  $\forall n Q(n) \equiv \forall n P(n)$  **Template for induction from a different base case** 

**1.** "Let P(n) be.... We will show that P(n) is true for all integers  $n \ge b$  by induction."

- **2.** "Base Case:" Prove P(b)
- **3. "Inductive Hypothesis:**

Assume that for some arbitrary integer  $k \ge b$ ,

P(k) is true"

**4.** "Inductive Step:" Prove that P(k + 1) is true:

Use the goal to figure out what you need.

Make sure you are using I.H. and point out where you are using it. (Don't assume P(k + 1) !!)

**5.** "Conclusion: P(n) is true for all integers  $n \ge b$ "

# **Strong** Inductive Proofs In 5 Easy Steps

- **1.** "Let P(n) be.... We will show that P(n) is true for all integers  $n \ge b$  by strong induction."
- **2.** "Base Case:" Prove P(b)
- **3. "Inductive Hypothesis:**

Assume that for some arbitrary integer  $k \ge b$ ,

P(j) is true for every integer *j* from *b* to k"

**4.** "Inductive Step:" Prove that P(k + 1) is true:

Use the goal to figure out what you need.

Make sure you are using I.H. (that P(b), ..., P(k) are true) and point out where you are using it. (Don't assume P(k + 1) !!)

**5.** "Conclusion: P(n) is true for all integers  $n \ge b$ "

An integer *p* greater than 1 is called *prime* if the only positive factors of *p* are 1 and *p*.

$$p > 1 \land \forall x ((x \mid p) \rightarrow ((x = 1) \lor (x = p)))$$

A positive integer that is greater than 1 and is not prime is called *composite*.

 $p > 1 \land \exists x ((x \mid p) \land (x \neq 1) \land (x \neq p))$ 

# **Fundamental Theorem of Arithmetic**

Every integer > 1 has a unique prime factorization

 $48 = 2 \cdot 2 \cdot 2 \cdot 2 \cdot 3$   $591 = 3 \cdot 197$  45,523 = 45,523  $321,950 = 2 \cdot 5 \cdot 5 \cdot 47 \cdot 137$  $1,234,567,890 = 2 \cdot 3 \cdot 3 \cdot 5 \cdot 3,607 \cdot 3,803$ 

We use strong induction to prove that a factorization into primes exists, but not that it is unique.

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Goal: Show P(k+1); i.e. k+1 is a product of primes

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for some primes  $p_1, p_2, ..., p_r, q_1, q_2, ..., q_s$ .

Thus,  $k+1 = ab = p_1p_2 \cdots p_rq_1q_2 \cdots q_s$  which is a product of primes. Since  $k \ge 2$ , one of these cases must happen and so P(k+1) is true.

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Thus,  $k+1 = ab = p_1p_2 \cdots p_rq_1q_2 \cdots q_s$  which is a product of primes. Since  $k \ge 2$ , one of these cases must happen and so P(k+1) is true.

**5.** Thus P(n) is true for all integers  $n \ge 2$ , by strong induction.

# Applications

# **Algorithmic Problems**

- Multiplication
  - Given primes  $p_1, p_2, ..., p_k$ , calculate their product  $p_1p_2 ... p_k$
- Factoring
  - Given an integer n, determine the prime factorization of n

Factor the following 232 digit number [RSA768]:

# **Famous Algorithmic Problems**

- Factoring
  - Given an integer n, determine the prime factorization of n
- Primality Testing
  - Given an integer n, determine if n is prime

- Factoring is hard
  - (on a classical computer)
- Primality Testing is easy

### **GCD** and Factoring

- $a = 2^3 \cdot 3 \cdot 5^2 \cdot 7 \cdot 11 = 46,200$
- $b = 2 \cdot 3^2 \cdot 5^3 \cdot 7 \cdot 13 = 204,750$

 $GCD(a, b) = 2^{\min(3,1)} \cdot 3^{\min(1,2)} \cdot 5^{\min(2,3)} \cdot 7^{\min(1,1)} \cdot 11^{\min(1,0)} \cdot 13^{\min(0,1)}$ 

### **Factoring is hard**

Yet, we can compute GCD(a,b) without factoring!

Will shortly see **another** operation that can be implemented surprisingly quickly...

# **Basic Applications of mod**

- Two's Complement
- Hashing
- Pseudo random number generation

• Represent integer *x* as sum of powers of 2:

99= 64 + 32 + 2 + 1 $= 2^6 + 2^5 + 2^1 + 2^0$ 18= 16 + 2 $= 2^4 + 2^1$ 

- Binary representation shows which powers are used:
  - 99: 0110 0011
  - 18: 0001 0010

• Suppose we write numbers with 4 bits:

$$14$$
 $= 8 + 4 + 2$  $= 2^3 + 2^2 + 2^1$  $= 1110$  $11$  $= 8 + 2 + 1$  $= 2^3 + 2^1 + 2^0$  $= 1011$ 

• Largest number we can write in 4 bits is:

$$15 = 8 + 4 + 2 + 1 = 2^3 + 2^2 + 2^1 + 2^0 = 1111$$

Note that 15 = 16 - 1 = 2<sup>4</sup> - 1
 we proved this before!

• Suppose we write numbers with 4 bits (0..15):

14 = 
$$8 + 4 + 2$$
 =  $2^3 + 2^2 + 2^1$  = 1110  
11 =  $8 + 2 + 1$  =  $2^3 + 2^1 + 2^0$  = 1011

• Adding these numbers gives us 25 with 5 bits:

$$25 = 16 + 8 + 1 = 2^4 + 2^3 + 2^0 = 11001$$

• If we drop the highest bit, we have

9 = 
$$8 + 1$$
 =  $2^3 + 2^0$  = 1001

25 = 
$$16 + 8 + 1$$
 =  $2^4 + 2^3 + 2^0$  = 11001  
9 =  $8 + 1$  =  $2^3 + 2^0$  = 1001

- Note that  $9 \equiv_{16} 25$  since 25 9 = 16
  - dropping 2<sup>4</sup> bit subtracts 16
  - dropping  $2^5$  bit subtracts  $32 = 2 \cdot 16$
  - dropping  $2^6$  bit subtracts 64 = 4.16
- Throwing away all but 4 bits is arithmetic mod 16
  - easier to implement normal arithmetic!

• Largest representable number is  $2^n - 1$ 

 $2^{n} = 100...000$  (n+1 bits)  $2^{n} - 1 = 11...111$  (n bits)

THE WALL STREET JOURNAL.

Berkshire Hathaway's Stock Price Is Too Much for Computers

32 bits 1 = \$0.0001 \$429,496.7295 max

**Berkshire Hathaway Inc. (BRK-A)** NYSE - Nasdaq Real Time Price. Currency in USD



```
      n-bit signed integers

      Suppose that -2^{n-1} < x < 2^{n-1}

      First bit as the sign, n - 1 bits for the value

      99 = 64 + 32 + 2 + 1

      18 = 16 + 2

      For n = 8:

      99:
      0110

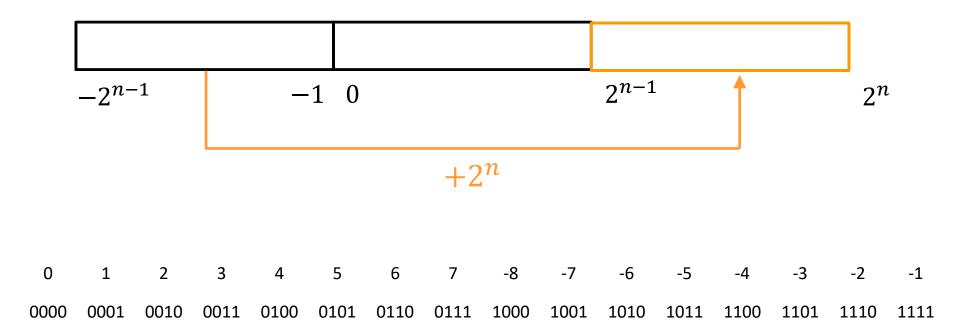
      -18:

      1001
```

Problem: this has both +0 and -0 (annoying)

## **Two's Complement Representation**

Suppose that  $0 \le x < 2^{n-1}$  x is represented by the binary representation of xSuppose that  $-2^{n-1} \le x < 0$  x is represented by the binary representation of  $x + 2^n$ result is in the range  $2^{n-1} \le x < 2^n$ 



# **Two's Complement Representation**

Suppose that  $0 \le x < 2^{n-1}$ x is represented by the binary representation of x Suppose that  $-2^{n-1} \le x < 0$ x is represented by the binary representation of  $x + 2^n$ result is in the range  $2^{n-1} \le x < 2^n$ 7 -8 -7 0 1 2 3 4 5 6 -6 -5 -3 -4 -2 -1 0000 0001 0010 0011 0100 0101 0110 0111 1000 1001 1010 1011 1100 1101 1110 1111

For n = 8: 99: 0110 0011 -18: 1110 1110 (-18 + 256 = 238)

## **Two's Complement Representation**

Suppose that  $0 \le x < 2^{n-1}$  x is represented by the binary representation of xSuppose that  $-2^{n-1} \le x < 0$  x is represented by the binary representation of  $x + 2^n$ result is in the range  $2^{n-1} \le x < 2^n$ 

0	1	2	3	4	5	6	7	-8	-7	-6	-5	-4	-3	-2	-1
0000	0001	0010	0011	0100	0101	0110	0111	1000	1001	1010	1011	1100	1101	1110	1111

**Key property:** First bit is still the sign bit!

**Key property:** Twos complement representation of any number y is equivalent to  $y \mod 2^n$  so arithmetic works  $\mod 2^n$ 

$$y + 2^n \equiv_{2^n} y$$

```
public class Test {
   final static int SEC IN YEAR = 365*24*60*60;
   public static void main(String args[]) {
       System.out.println(
          "I will be alive for at least " +
          SEC_IN_YEAR * 101 + " seconds."
       );
   }
}
          ----jGRASP exec: java Test
        I will be alive for at least -186619904 seconds.
          ----jGRASP: operation complete.
```

- For  $0 < x \le 2^{n-1}$ , -x is represented by the binary representation of  $-x + 2^n$ 
  - How do we calculate –x from x?
  - E.g., what happens for "return -x;" in Java?

$$-x + 2^n = (2^n - 1) - x + 1$$

To compute this, flip the bits of x then add 1!
 Flip the bits of x means replace x by 2<sup>n</sup> - 1 - x
 Then add 1 to get -x + 2<sup>n</sup>

## **Exponentiation**

• **Compute** 78365<sup>81453</sup>

• Compute 78365<sup>81453</sup> mod 104729

• Output is small

need to keep intermediate results small

Since  $b = qm + (b \mod m)$ , we have  $b \mod m \equiv_m b$ .

And since  $c = tm + (c \mod m)$ , we have  $c \mod m \equiv_m c$ .

Multiplying these gives  $(b \mod m)(c \mod m) \equiv_m bc$ .

By the Lemma from a few lectures ago, this tells us  $bc \mod m = (b \mod m)(c \mod m) \mod m$ .

Okay to mod b and c by m before multiplying if we are planning to mod the result by m

Since  $b \mod m \equiv_m b$  and  $c \mod m \equiv_m c$ we have  $bc \mod m = (b \mod m)(c \mod m) \mod m$ 

So  $a^2 \mod m = (a \mod m)^2 \mod m$ and  $a^4 \mod m = (a^2 \mod m)^2 \mod m$ and  $a^8 \mod m = (a^4 \mod m)^2 \mod m$ and  $a^{16} \mod m = (a^8 \mod m)^2 \mod m$ and  $a^{32} \mod m = (a^{16} \mod m)^2 \mod m$ 

Can compute  $a^k \mod m$  for  $k = 2^i$  in only *i* steps What if *k* is not a power of 2?

## **Fast Exponentiation Algorithm**

81453 in binary is 10011111000101101  $81453 = 2^{16} + 2^{13} + 2^{12} + 2^{11} + 2^{10} + 2^9 + 2^5 + 2^3 + 2^2 + 2^0$  $a^{81453} = a^{2^{16}} \cdot a^{2^{13}} \cdot a^{2^{12}} \cdot a^{2^{11}} \cdot a^{2^{10}} \cdot a^{2^9} \cdot a^{2^5} \cdot a^{2^3} \cdot a^{2^2} \cdot a^{2^0}$ a<sup>81453</sup> mod m=  $(...(((((a^{2^{16}} \mod m) a^{2^{13}} \mod m) \mod m) a^{2^{12}} \mod m) \mod m$ Uses only 16 + 9 = 25  $a^{2^{11}} \mod m$ ) mod m multiplications a<sup>210</sup> mod m) mod m a<sup>29</sup> mod m) mod m  $a^{2^5} \mod m$ ) mod m  $a^{2^3} \mod m$ ) mod m  $a^{2^2} \mod m$ ) mod m ·  $a^{2^0} \mod m$ ) mod m The fast exponentiation algorithm computes  $a^k \mod m$  using  $\leq 2\log k$  multiplications mod m

# **Using Fast Modular Exponentiation**

- Your e-commerce web transactions use SSL (Secure Socket Layer) based on RSA encryption
- RSA
  - Vendor chooses random 512-bit or 1024-bit primes p, qand 512/1024-bit exponent e. Computes  $m = p \cdot q$
  - Vendor broadcasts (*m*, *e*)
  - To send *a* to vendor, you compute  $C = a^e \mod m$  using fast modular exponentiation and send *C* to the vendor.
  - Using secret p, q the vendor computes d that is the multiplicative inverse of  $e \mod (p-1)(q-1)$ .
  - Vendor computes  $C^d \mod m$  using fast modular exponentiation.
  - Fact:  $a = C^d \mod m$  for 0 < a < m unless p|a or q|a

#### Scenario:

Map a small number of data values from a large domain  $\{0, 1, ..., M - 1\}$  ...

...into a small set of locations  $\{0, 1, ..., n - 1\}$  so one can quickly check if some value is present

- $hash(x) = x \mod p$  for p a prime close to n- or  $hash(x) = (ax + c) \mod p$
- Latter depends on all the bits of the data

- hash(x) and hash(x + 1) can be very far apart

•  $hash(x) = (ax + c) \mod p$  for prime p

- deterministic function with random-ish behavior

• Suppose that hash(x) = hash(y)...

$$ax + c \equiv_p ay + c$$
 $ax \equiv_p ay$  $add -c$  to both sides $x \equiv_p y$ multiply both sides by swhere  $as \equiv_p 1$ 

• Output as evenly spread as  $hash(x) = x \mod p$ 

•  $hash(x) = (ax + c) \mod p$  for prime p

deterministic function with random-ish behavior

- Applications
  - map integer to location in array (hash tables)
  - map user ID or IP address to machine

requests from the same user / IP address go to the same machine requests from different users / IP addresses spread randomly

### **Pseudo-Random Number Generation**

**Linear Congruential method** 

$$x_{n+1} = (a x_n + c) \mod m$$

Choose random  $x_0$ , a, c, m and produce a long sequence of  $x_n$ 's