#### Great Theoretical I deas In Computer Science

Steven Rudich

CS 15-251

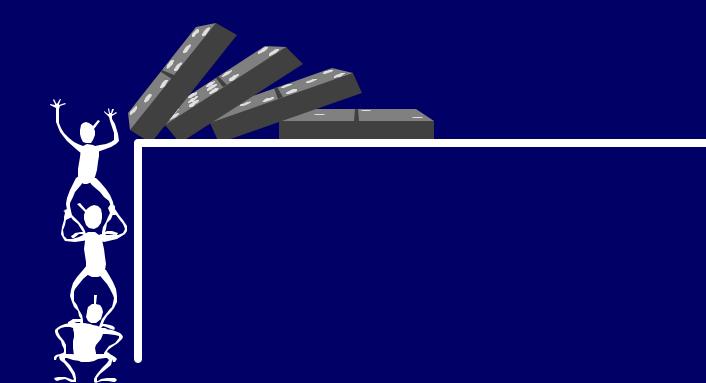
Spring 2005

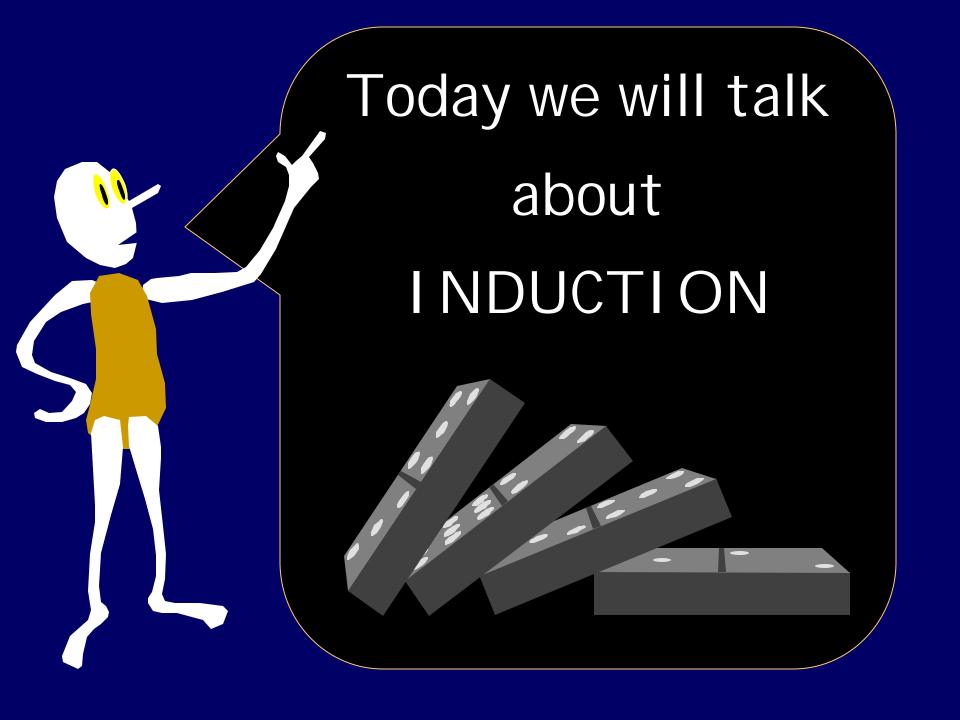
Lecture 1

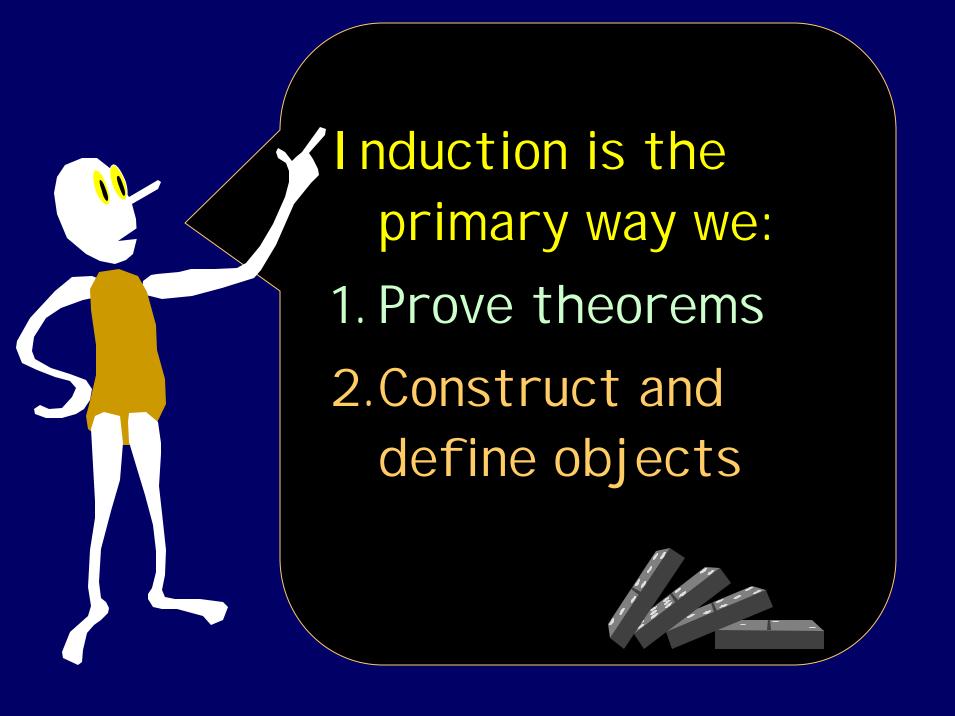
Jan 11, 2005

Carnegie Mellon University

### Induction: One Step At A Time





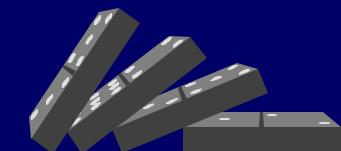


### Let's start with dominoes





Domino Principle: Line up any number of dominos in a row; knock the first one over and they will all fall.

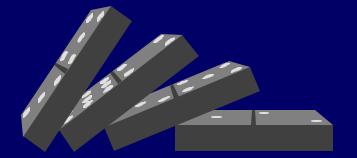


### n dominoes numbered 1 to n

### F<sub>k</sub> The k<sup>th</sup> domino falls

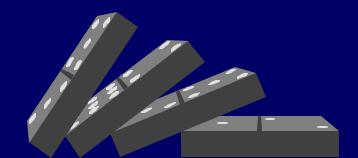
If we set them all up in a row then we know that each one is set up to knock over the next one:

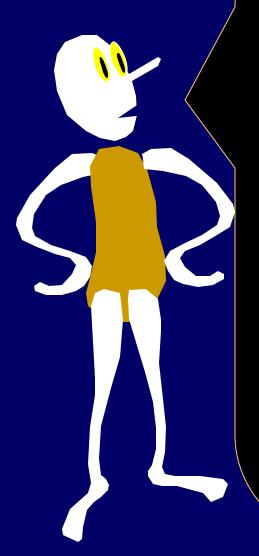
For all 
$$1 = k < n$$
:  
 $F_k$ )  $F_{k+1}$ 



### n dominoes numbered 1 to n

 $F_k$  The  $k^{th}$  domino falls For all 1 = k < n:  $F_k$ )  $F_{k+1}$ 





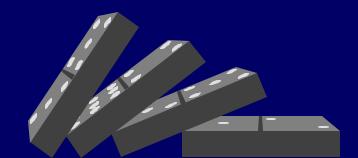
Computer Scientists don't start numbering things at 1, they start at 0.

YOU will spend a career doing this, so GET USED TO IT NOW.

### n dominoes numbered 0 to n-1

 $F_k$  The  $k^{th}$  domino falls For all 0 = k < n-1:  $F_k$   $F_{k+1}$ 

$$F_0$$
)  $F_1$ )  $F_2$ ) ...  $F_0$ ) All Dominoes Fall



## Standard Notation/Abbreviation "for all" is written "8"

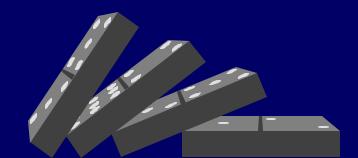
Example:

For all k>0, P(k) is equivalent to 8k>0, P(k)

### n dominoes numbered 0 to n-1

$$F_k$$
 The  $k^{th}$  domino falls  $8k$ ,  $0 = k < n-1$ :  $F_k$   $F_{k+1}$ 

$$F_0$$
)  $F_1$ )  $F_2$ ) ...  $F_0$ ) All Dominoes Fall



### The Natural Numbers

$$\mathbb{N} = \{ 0, 1, 2, 3, \ldots \}$$

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$$\mathbb{N} = \{ 0, 1, 2, 3, \ldots \}$$

One domino for each natural number:

# The Infinite Domino Principle F<sub>k</sub> ´ The k<sup>th</sup> domino falls

Suppose  $F_0$ Suppose for each natural number k,  $F_k$ )  $F_{k+1}$ Then All Dominoes Fall!

$$F_0$$
)  $F_1$ )  $F_2$ ) ...

# The Infinite Domino Principle F<sub>k</sub> ´ The k<sup>th</sup> domino falls

Suppose  $F_0$ Suppose for each natural number k,  $F_k$ )  $F_{k+1}$ 

Then All Dominoes Fall!

Proof: If they do not all fall, there must be a least numbered domino d>0 that did not fall. Hence,  $F_{d-1}$  and not  $F_d$ .  $F_{d-1}$ )  $F_d$ . Hence, domino d fell and did not fall. Contradiction.



# Mathematical Induction: statements proved instead of dominoes fallen

Infinite sequence of dominoes.

F<sub>k</sub> ´ domino k falls

Infinite sequence of statements:  $S_0$ ,  $S_1$ , ...  $F_k$   $S_k$  proved

Establish 1)  $F_0$ 2) 8 k,  $F_k$ )  $F_{k+1}$ 

Conclude that F<sub>k</sub> is true for all k



## Inductive Proof / Reasoning To Prove $\forall k$ , $S_k$

```
Establish "Base Case": S_0
Establish "Domino Property": \forall k, S_k) S_{k+1}
```

 $\forall k, S_k$ )  $S_{k+1}$ 

Assume hypothetically that  $S_k$  for any particular k;

Conclude that S<sub>k+1</sub>



# Inductive Proof / Reasoning To Prove ∀k, S<sub>k</sub>

```
Establish "Base Case": S_0
Establish "Domino Property": \forall k, S_k) S_{k+1}
```

```
\forall k, S_k) S_{k+1} \underbrace{ \frac{\text{"Induction Hypothesis"}}{\text{Use I.H. to show S}_{k+1}} S_k}
```

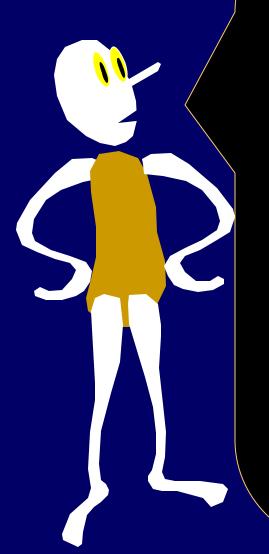


# Inductive Proof / Reasoning To Prove ∀k₃ b, S<sub>k</sub>

```
Establish "Base Case": S_b
Establish "Domino Property": \forall k_s b, S_k) S_{k+1}
```

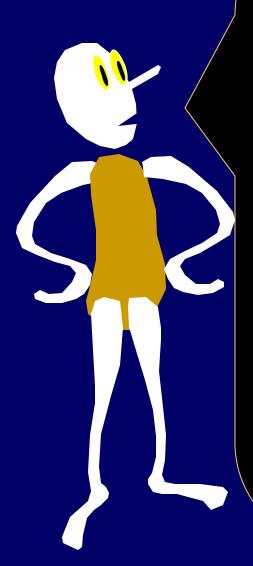
Assume k<sub>3</sub> b

Assume "Inductive Hypothesis":  $S_k$ Prove that  $S_{k+1}$  follows



Theorem?

The sum of the first n odd numbers is n<sup>2</sup>.



### Theorem?

The sum of the first n odd numbers is n<sup>2</sup>.

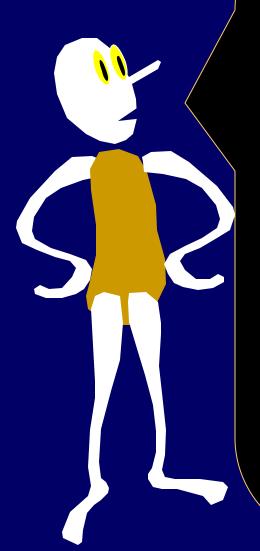
## CHECK IT OUT ON SMALL VALUES:

1 = 1

1+3 = 4

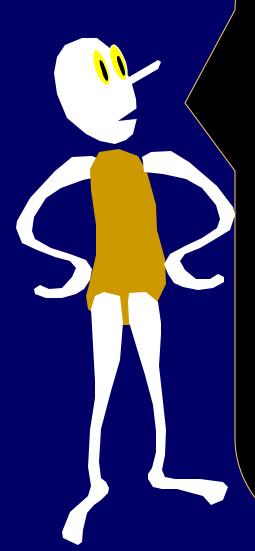
1+3+5 = 9

1+3+5+7 = 16



Theorem: The sum of the first n odd numbers is n<sup>2</sup>.

The k<sup>th</sup> odd number is expressed by the formula (2k – 1), when k>0.

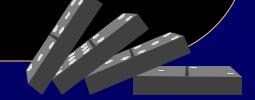


 $S_n \equiv$ 

"The sum of the first n odd numbers is n<sup>2</sup>."

Equivalently, S<sub>n</sub> is the statement that:

$$\sum_{1 \le k \le n} (2k-1)$$
  
=1 + 3 + 5 + (2k-1) + . . +(2n-1)  
=  $n^2$ 



 $S_n =$  "The sum of the first n odd numbers is  $n^2$ ." "1 + 3 + 5 + (2k-1) + . . +(2n-1)=  $n^2$ "

Trying to establish that:  $8n_{s} 1 S_{n}$ 

Base case: S<sub>1</sub> is true

The sum of the first 1 odd numbers is 1.

 $S_n = \text{``The sum of the first n odd numbers is } n^2.\text{''}$  $"1 + 3 + 5 + (2k-1) + ... + (2n-1) = n^2"$ 

Trying to establish that:  $8n_{s} 1 S_{n}$ 

Assume "Induction Hypothesis": S<sub>k</sub> (for any particular k<sub>s</sub> 1)

$$1+3+5+...+(2k-1) = k^2$$

$$S_n =$$
 "The sum of the first n odd numbers is  $n^2$ ."   
 "1 + 3 + 5 + (2k-1) + . . +(2n-1)=  $n^2$ "

Trying to establish that:  $8n_{s} 1 S_{n}$ 

Assume "Induction Hypothesis":  $S_k$  (for any particular  $k_s$  1)

1+3+5+...+ (2k-1) = 
$$k^2$$
  
Add (2k+1) to both sides.  
1+3+5+...+ (2k-1)+(2k+1) =  $k^2$ +(2k+1)  
Sum of first k+1 odd numbers =  $(k+1)^2$   
CONCLUSE:  $S_{k+1}$ 

 $S_n =$  "The sum of the first n odd numbers is  $n^2$ ." "1 + 3 + 5 + (2k-1) + . . +(2n-1)=  $n^2$ "

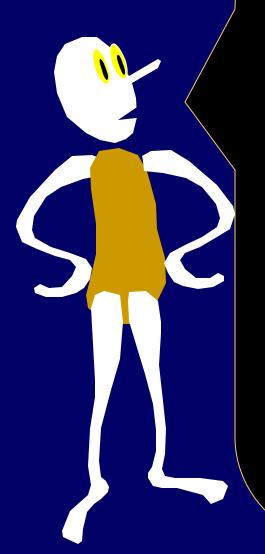
Trying to establish that: 8n , 1 S<sub>n</sub>

Established base case: S<sub>1</sub>

Established domino property:  $8 k_s 1 S_k$ )  $S_{k+1}$ 

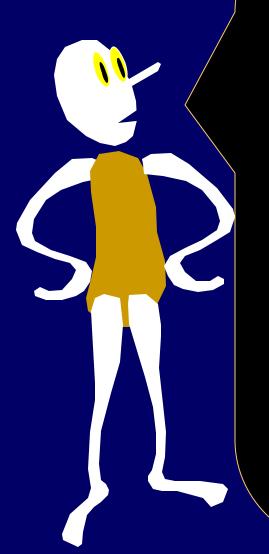
By induction of n, we conclude that:

8n, 1 Sn



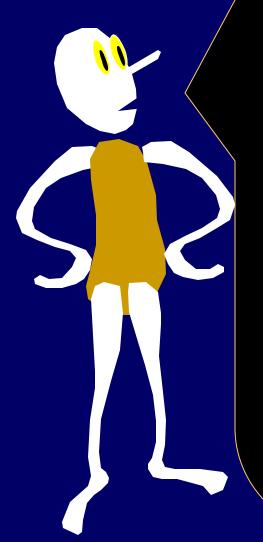
### THEOREM:

The sum of the first n odd numbers is n<sup>2</sup>.



Theorem?

The sum of the first n numbers is ½n(n+1).



Theorem? The sum of the first n numbers is ½n(n+1).

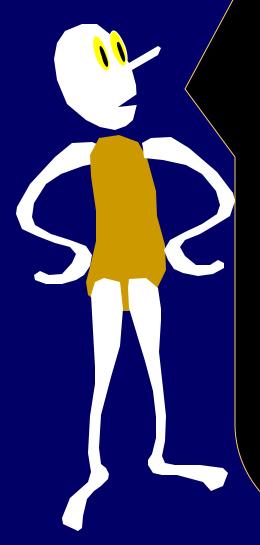
Try it out on small numbers!

$$1 = 1 = 1/2 1(1+1).$$

$$1+2 = 3 = \frac{1}{2} 2(2+1).$$

$$1+2+3 = 6 = \frac{1}{2} 3(3+1).$$

$$1+2+3+4 = 10=\frac{1}{2} 4(4+1)$$
.



Theorem? The sum of the first n numbers is ½n(n+1).

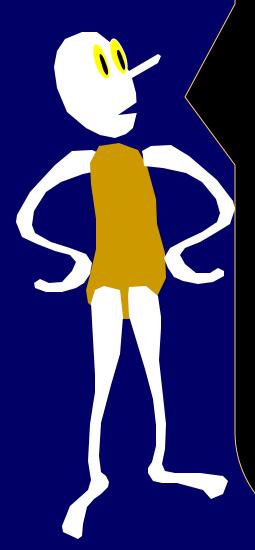
$$= 0 = \frac{1}{2} 0(0+1).$$

$$1 = 1 = \frac{1}{2} 1(1+1).$$

$$1+2 = 3 = \frac{1}{2} 2(2+1).$$

$$1+2+3 = 6 = \frac{1}{2} 3(3+1).$$

$$1+2+3+4 = 10=\frac{1}{2} 4(4+1).$$



### Notation:

$$\Delta_{O} = 0$$

$$\Delta_{n}$$
= 1 + 2 + 3 + . . . + n-1 + n

Let 
$$S_n$$

$$"\Delta_n = n(n+1)/2"$$



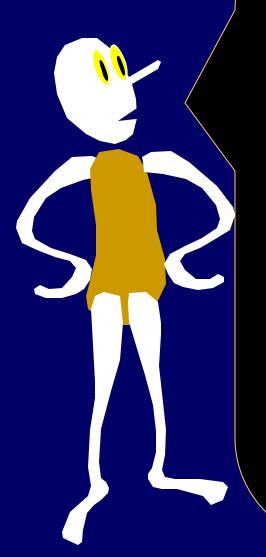
## $S_n$ " $\Delta_n = n(n+1)/2$ " Use induction to prove $\forall k \geqslant 0$ , $S_k$

Establish "Base Case":  $S_0$   $\Delta_0$ =The sum of the first 0 numbers = 0. Setting n=0 the formula gives O(0+1)/2 = 0.

Establish "Domino Property":  $\forall k \in (0, S_k) \in S_{k+1}$ 

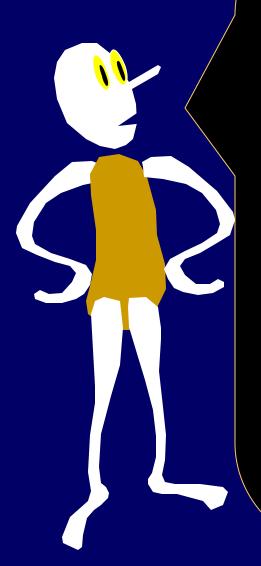
"Inductive Hypothesis"  $S_k$ :  $\Delta_k = k(k+1)/2$ 

$$\Delta_{k+1} = \Delta_k + (k+1)$$
  
=  $k(k+1)/2 + (k+1)$  [Using I.H.]  
=  $(k+1)(k+2)/2$  [which proves  $S_{k+1}$ ]



### THEOREM:

The sum of the first n numbers is ½n(n+1).



A natural number n>1 is <u>prime</u> if it has no divisors besides 1 and itself.

N.B.1 is not considered prime.

### Easy theorem:

Every natural number>1 can be factored into primes.

### N.B.:

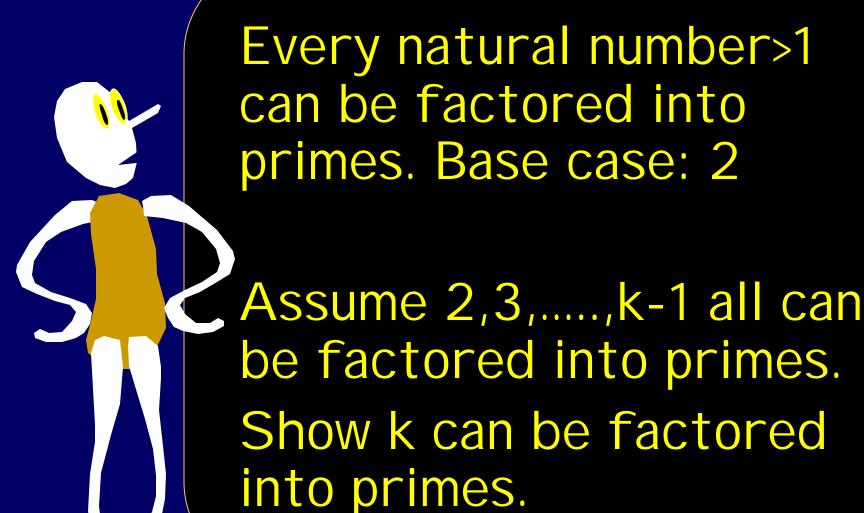
It is much more subtle to argue for the existence of a unique prime factorization

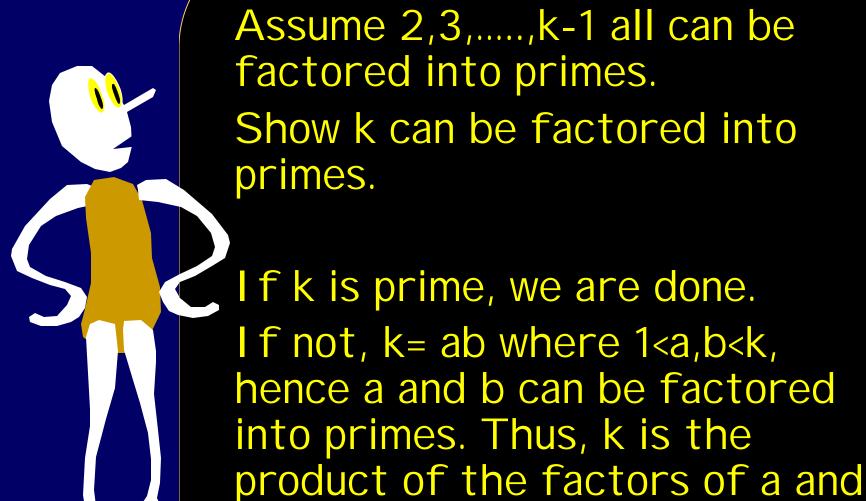


Every natural number>1 can be factored into primes.

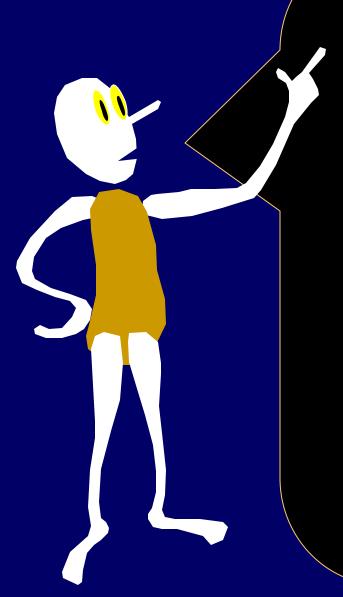
 $S_n \equiv$  "n can be factored into primes"

S<sub>2</sub> is true because 2 is prime.





the factors of b.



This illustrates a technical point about using and defining mathematical induction.



# All Previous Induction To Prove $\forall k, S_k$

Establish "Base Case": So

Establish that  $\forall k, S_k$  )  $S_{k+1}$ 

Let k be any natural number.

Induction Hypothesis:

Assume  $\forall j < k, S_j$ 

Derive  $S_k$ 



# "Strong" Induction To Prove ∀k, S<sub>k</sub>

Establish "Base Case": So

Establish that  $\forall k, S_k$ )  $S_{k+1}$ 

Let k be any natural number.

Assume  $\forall j < k, S_j$ Prove  $S_k$ 



# Least Counter-Example Induction to Prove $\forall k$ , $S_k$

Establish "Base Case":  $S_0$ Establish that  $\forall k, S_k$ )  $S_{k+1}$ 

Assume that  $S_k$  is the least counterexample.

Derive the existence of a smaller counter-example

All numbers > 1 has a prime factorization.

Let n be the least counter-example. n must not be prime - so n = ab. If both a and b had prime factorizations, then n would. Thus either a or b is a smaller counter-example.

# Inductive reasoning is the high level idea:

"Standard" Induction

"Least Counter-example"

"All Previous" Induction

all just

different packaging.



# "All Previous" Induction Can Be Repackaged As Standard Induction

Establish "Base Case": S<sub>0</sub>

Establish that  $\forall k, S_k$  )  $S_{k+1}$ Let k be any natural number. Assume  $\forall j < k, S_j$ Prove  $S_k$  Define  $T_i = \forall j \cdot i, S_j$ 

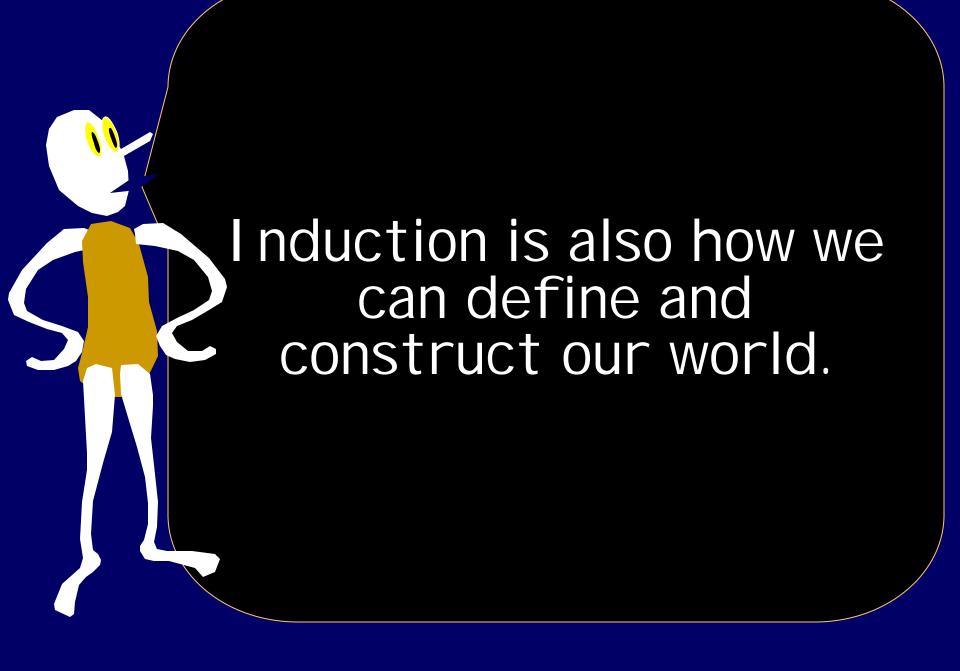
Establish "Base Case": T<sub>0</sub>

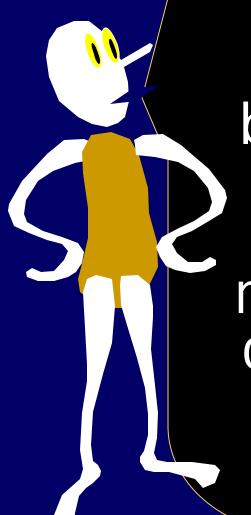
Establish that  $\forall k, T_k$ )  $T_{k+1}$ 

Let k be any natural number.

Assume T<sub>k-1</sub>

Prove T<sub>k</sub>





So many things, from buildings to computers, are built up stage by stage, module by module, each depending on the previous stages.





### Inductive Definition Of Functions

### Stage O, Initial Condition, or Base Case:

Declare the value of the function on some subset of the domain.

### Inductive Rules

Define new values of the function in terms of previously defined values of the function

F(x) is defined if and only if it is implied by finite iteration of the rules.



### Inductive Definition Of Functions

### Stage O, Initial Condition, or Base Case:

Declare the value of the function on some subset of the domain.

### Inductive Rules

Define new values of the function in terms of previously defined values of the function

If there is an x such that F(x) has more than one value – then the whole inductive definition is said to be inconsistent.



### Initial Condition, or Base Case:

$$F(0) = 1$$

For 
$$n>0$$
,  $F(n) = F(n-1) + F(n-1)$ 

n	0	1	2	3	4	5	6	7
F(n)	1							



### Initial Condition, or Base Case:

$$F(0) = 1$$

For 
$$n>0$$
,  $F(n) = F(n-1) + F(n-1)$ 

n	O	1	2	3	4	5	6	7
F(n)	1	2						



### Initial Condition, or Base Case:

$$F(0) = 1$$

For 
$$n>0$$
,  $F(n) = F(n-1) + F(n-1)$ 

n	O	1	2	3	4	5	6	7
F(n)	1	2	4					



### Initial Condition, or Base Case:

$$F(0) = 1$$

For 
$$n>0$$
,  $F(n) = F(n-1) + F(n-1)$ 

n	0	1	2	3	4	5	6	7
F(n)	1	2	4	8	16	32	64	128



### Initial Condition, or Base Case:

$$F(0) = 1$$

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$$n>0$$
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n	0	1	2	3	4	5	6	7
F(n)	1	2	4	8	16	32	64	128



### Initial Condition, or Base Case:

$$F(1) = 1$$

For 
$$n>1$$
,  $F(n) = F(n/2) + F(n/2)$ 

n	0	1	2	3	4	5	6	7
F(n)		1						



### Initial Condition, or Base Case:

$$F(1) = 1$$

For 
$$n>1$$
,  $F(n) = F(n/2) + F(n/2)$ 

n	0	1	2	3	4	5	6	7
F(n)		1	2					



### Initial Condition, or Base Case:

$$F(1) = 1$$

For 
$$n>1$$
,  $F(n) = F(n/2) + F(n/2)$ 

n	0	1	2	3	4	5	6	7
F(n)		1	2		4			



### Initial Condition, or Base Case:

$$F(1) = 1$$

For 
$$n>1$$
,  $F(n) = F(n/2) + F(n/2)$ 

n	O	1	2	3	4	5	6	7
F(n)	%	1	2	%	4	%	%	%



# Inductive Definition Recurrence Relation F(X) = X for X a whole power of 2.

### Initial Condition, or Base Case:

$$F(1) = 1$$

For 
$$n>1$$
,  $F(n) = F(n/2) + F(n/2)$ 

n	O	1	2	3	4	5	6	7
F(n)	%	1	2	%	4	%	%	%



Inductive Rule:  

$$8x,y2N, y>0, P(x,y) = P(x,y-1) + 1$$

P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2								
3								



P(x,y)	О	1	2	3	4	5	6	7
O	0							
1	1							
2	2							
3	3							



P(x,y)	O	1	2	3	4	5	6	7
O	0	1						
1	1	2						
2	2	3						
3	3	4						



P(x,y)	O	1	2	3	4	5	6	7
O	0	1	2					
1	1	2	3					
2	2	3	4					
3	3	4	5					



P(x,y)	O	1	2	3	4	5	6	7
O	0	1	2	3	4	5	6	7
1	1	2	3	4	5	6	7	8
2	2	3	4	5	6	7	8	9
3	3	4	5	6	7	8	9	10



X+Y	O	1	2	3	4	5	6	7
O	0	1	2	3	4	5	6	7
1	1	2	3	4	5	6	7	8
2	2	3	4	5	6	7	8	9
3	3	4	5	6	7	8	9	10

### Definition of P:

8x2N P(X,0) = X8x,y2N, y>0, P(x,y) = P(x,y-1) + 1

Any inductive definition with a finite number of base cases, can be translated into a program. The program simply calculates from the base cases on up.



 $8x2{0,1,2,3} P(X,0) = X$ 8x,y2N, y>0, P(x,y) = P(x,y-1) + 1

What would be the <u>bottom up</u> implementation of P?



```
For k = 0 to 3

P(k,0)=k

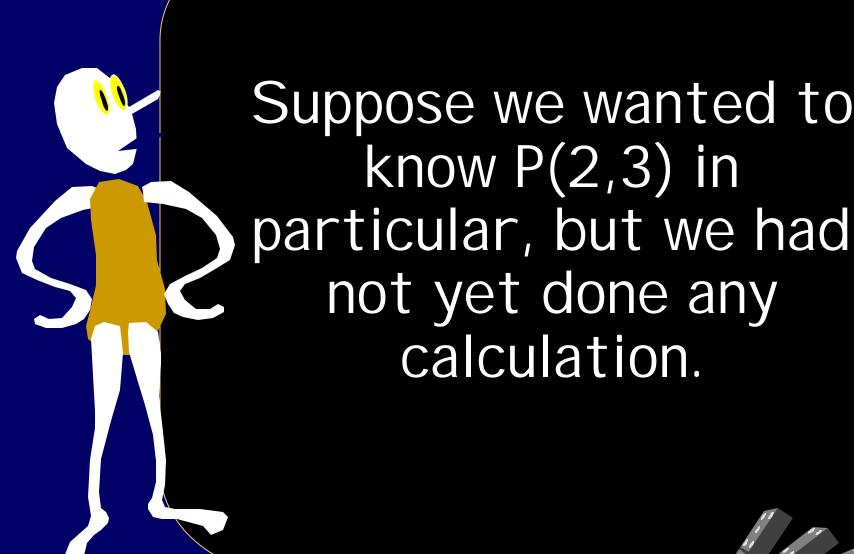
For j = 1 to 7

For k = 0 to 3

P(k,j) = P(k,j-1) + 1
```

## Bottom-Up Program for P

P(x,y)	O	1	2	3	4	5	6	7
O	0	1	2	3	4	5	6	7
1	1	2	3	4	5	6	7	8
2	2	3	4	5	6	7	8	9
3	3	4	5	6	7	8	9	10





P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2				?				
3								



P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2			?	?				
3								



P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2		?	?	?				
3								



Inductive Rule:  

$$8x,y2N, y>0, P(x,y) = P(x,y-1) + 1$$

P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2	?	?	?	?				
3								



P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2	2	?	?	?				
3								



P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2	2	3	?	?				
3								



P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2	2	3	4	?				
3								



P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2	2	3	4	5				
3								



# Procedure P(x,y): Top Down If y=0 return x Otherwise return P(x,y-1)+1;

P(x,y)	0	1	2	3	4	5	6	7
O								
1								
2	2	3	4	5				
3								



# Procedure P(x,y): If y=0 return xOtherwise return P(x,y-1)+1;

P(x,y)	O	1	2	3	4	5	6	7
O								
1								
2	2	3	4	5				
3								

Inductive Definition:  

$$8x2\mathbb{N} P(X,0) = X$$
  
 $8x,y2\mathbb{N}, y>0, P(x,y) = P(x,y-1) + 1$ 

```
Bottom-Up, I terative Program:

For k = 0 to 3

P(k,0)=k

For j = 1 to 7

For k = 0 to 3

P(k,j) = P(k,j-1) + 1
```



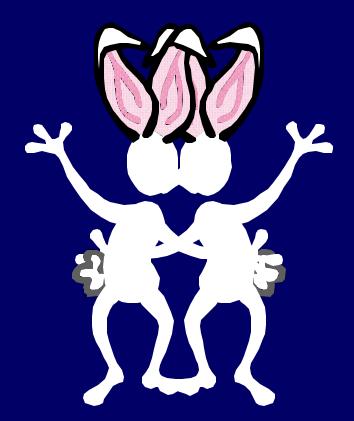
Top-Down, Recursive Program:
Procedure P(x,y):

If y=0 return x

Otherwise return P(x,y-1)+1;

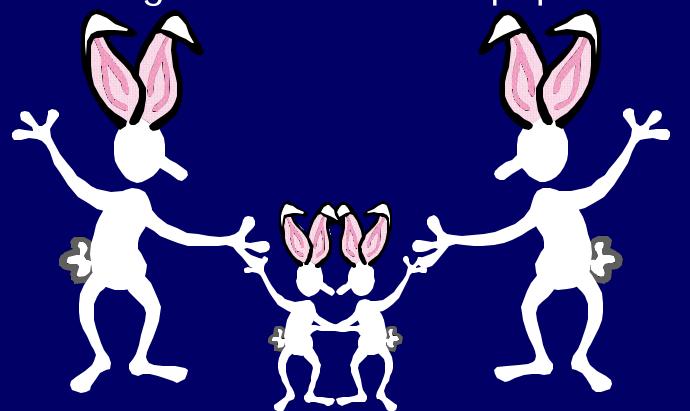
#### Leonardo Fibonacci

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- A rabbit lives forever
- The population starts as a single newborn pair
- •Every month, each productive pair begets a new pair which will become productive after 2 months old

month	1	2	3	4	5	6	7
rabbits							

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 $F_n$ = # of rabbit pairs at the beginning of the  $n^{th}$  month

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month	1	2	3	4	5	6	7
rabbits	1	1	2				

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month	1	2	3	4	5	6	7
rabbits	1	1	2	3			

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month	1	2	3	4	5	6	7
rabbits	1	1	2	3	5		

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rabbits	1	1	2	3	5	8	13



# Inductive Definition or Recurrence Relation for the Fibonacci Numbers

Stage O, Initial Condition, or Base Case:

$$Fib(1) = 1$$
;  $Fib(2) = 1$ 

#### Inductive Rule

For 
$$n>3$$
, Fib(n) = Fib(n-1) + Fib(n-2)

n	O	1	2	3	4	5	6	7
Fib(n)	%	1	1	2	3	5	8	13



# Inductive Definition or Recurrence Relation for the Fibonacci Numbers

Stage O, Initial Condition, or Base Case: Fib(0) = 0; Fib (1) = 1

#### Inductive Rule

For n>1, Fib(n) = Fib(n-1) + Fib(n-2)

n	O	1	2	3	4	5	6	7
Fib(n)	O	1	1	2	3	5	8	13

#### Inductive Definition: Fib(0)=0, Fib(1)=1, k>1, Fib(k)=Fib(k-1)+Fib(k-2)

```
Bottom-Up, I terative Program:
Fib(0) = 0; Fib(1) = 1;
Input x;
For k=2 to x do Fib(x)=Fiib(x-1)+Fib(x-2);
Return Fib(k);
Top-Down, Recursive Program:
      Procedure Fib(k)
                   If k=0 return 0
                    If k=1 return 1
                   Otherwise return Fib(k-1)+Fib(k-2);
```



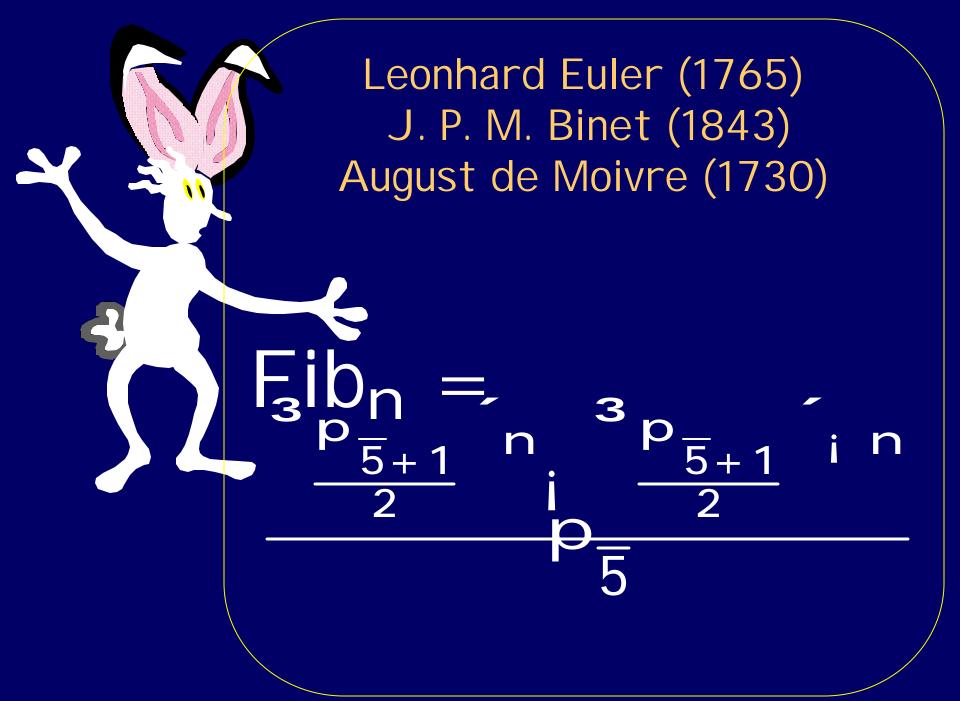
# What is a closed form formula for Fib(n) ????

Stage O, Initial Condition, or Base Case: Fib(0) = 0; Fib (1) = 1

#### Inductive Rule

For n>1, Fib(n) = Fib(n-1) + Fib(n-2)

n	O	1	2	3	4	5	6	7
Fib(n)	O	1	1	2	3	5	8	13





Inductive Proof

Standard Form

All Previous Form

Least-Counter Example Form

Invariant Form

Inductive Definition

Bottom-Up Programming

**Top-Down Programming** 

Recurrence Relations

Solving a Recurrence