

# 15-251

## Great Theoretical Ideas in Computer Science

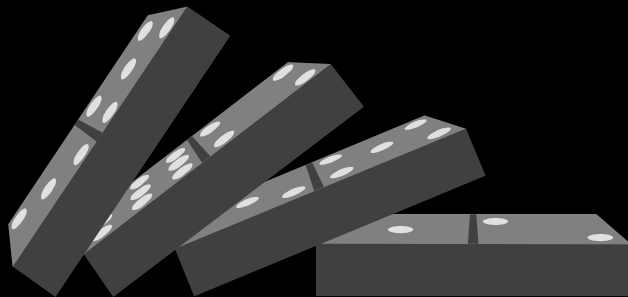


# Inductive Reasoning

Lecture 3 (September 4, 2007)

# Dominoes

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



# Dominoes Numbered 1 to n

$F_k = \text{"The } k^{\text{th}} \text{ domino falls"}$

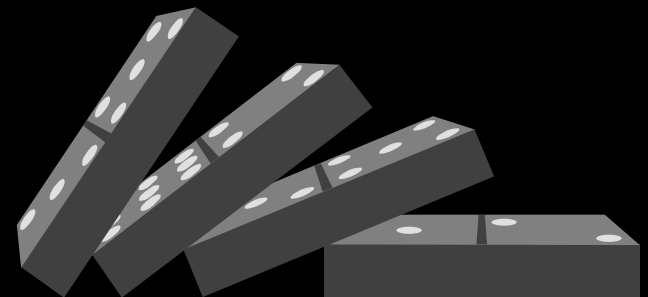
If we set them up in a row then each one is set up to knock over the next:

For all  $1 \leq k < n$ :

$$F_k \Rightarrow F_{k+1}$$

$$F_1 \Rightarrow F_2 \Rightarrow F_3 \Rightarrow \dots$$

$$F_1 \Rightarrow \text{All Dominoes Fall}$$



# Standard Notation

“for all” is written “ $\forall$ ”

Example:

**For all**  $k > 0$ ,  $P(k)$  =  $\forall k > 0$ ,  $P(k)$

# Dominoes Numbered 1 to n

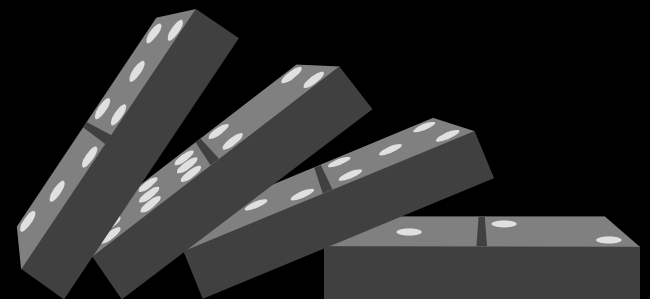
$F_k$  = “The  $k^{\text{th}}$  domino falls”

$\forall k, 0 \leq k < n-1:$

$$F_k \Rightarrow F_{k+1}$$

$$F_0 \Rightarrow F_1 \Rightarrow F_2 \Rightarrow \dots$$

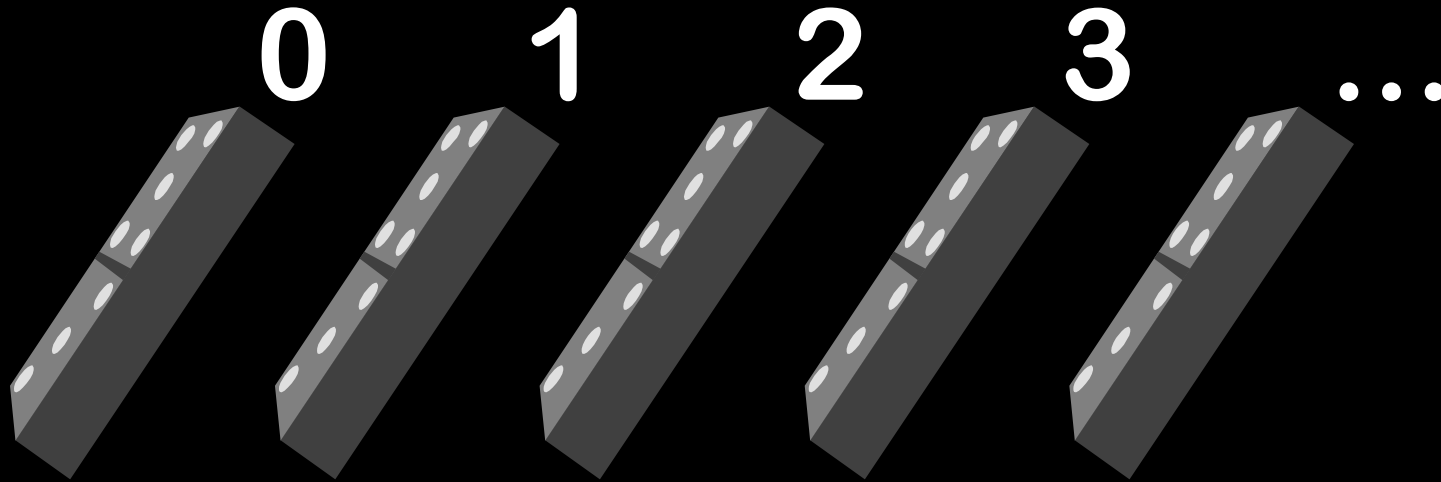
$$F_0 \Rightarrow \text{All Dominoes Fall}$$

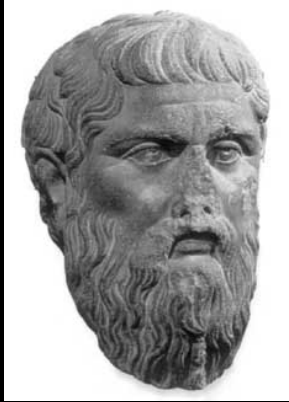


# The Natural Numbers

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

One domino for each natural number:



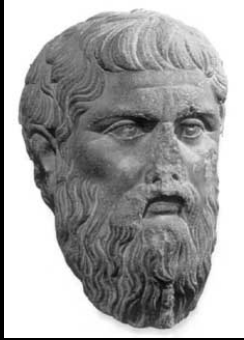


**Plato:** The Domino Principle works for an infinite row of dominoes

**Aristotle:** Never seen an infinite number of anything, much less dominoes.



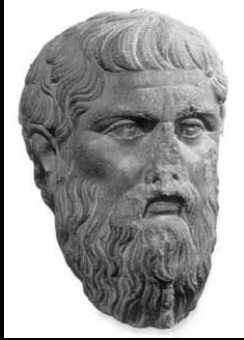




# Plato's Dominoes

One for each natural number

**Theorem:** An infinite row of dominoes,  
one domino for each natural number.  
Knock over the first domino and they all will fall



# Plato's Dominoes

## One for each natural number

**Theorem:** An infinite row of dominoes,  
one domino for each natural number.  
Knock over the first domino and they all will fall

Proof:

Suppose they don't all fall. Let  $k > 0$  be the **lowest numbered domino** that remains standing.

Domino  $k-1 \geq 0$  did fall, but  $k-1$  will knock over domino  $k$ . Thus, domino  $k$  must fall **and** remain standing.

Contradiction.



# Mathematical Induction

statements proved instead of  
dominoes fallen

Infinite sequence of  
dominoes

$F_k$  = “domino  $k$  fell”

Infinite sequence of  
statements:  $S_0, S_1, \dots$

$F_k$  = “ $S_k$  proved”

Establish: 1.  $F_0$

2. For all  $k$ ,  $F_k \Rightarrow F_{k+1}$

Conclude that  $F_k$  is true for all  $k$



# Inductive Proofs

To Prove  $\forall k \in \mathbb{N}, S_k$

Establish “Base Case”:  $S_0$

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

*Induction Hypothesis*

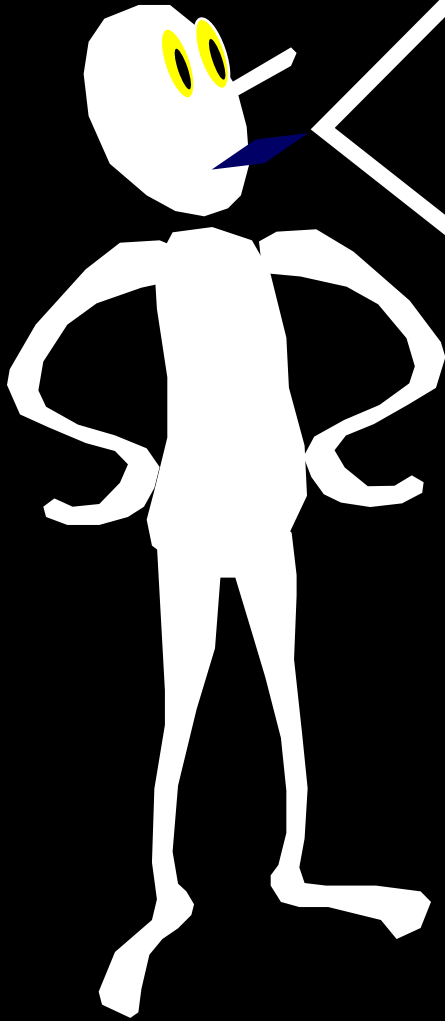
$\forall k, S_k \Rightarrow S_{k+1}$

Assume hypothetically that  $S_k$  for any particular  $k$ ;

Conclude that  $S_{k+1}$

# Theorem?

The sum of the first  $n$   
**odd** numbers is  $n^2$



$$1 = 1$$

$$1 + 3 = 2^2$$

$$1 + 3 + 5 = 9 = 3^2$$

# Theorem?

The sum of the first  $n$   
**odd** numbers is  $n^2$

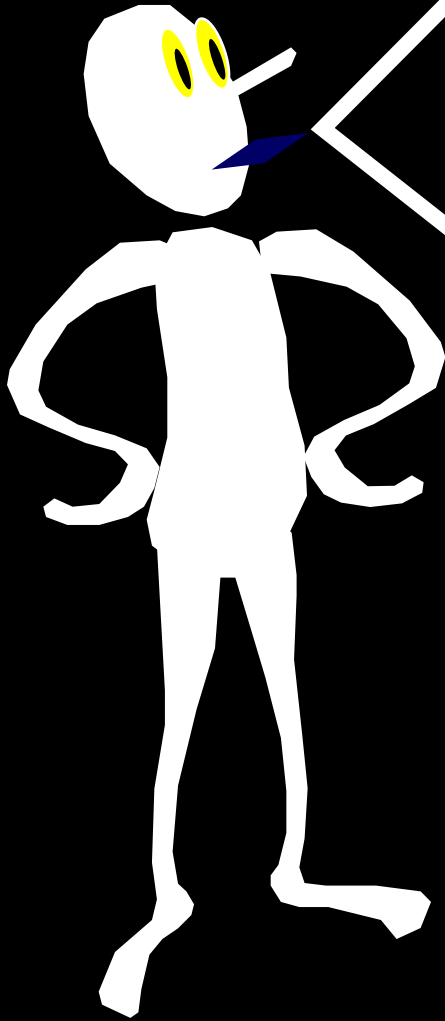
Check on small values:

$$1 = 1$$

$$1+3 = 4$$

$$1+3+5 = 9$$

$$1+3+5+7 = 16$$



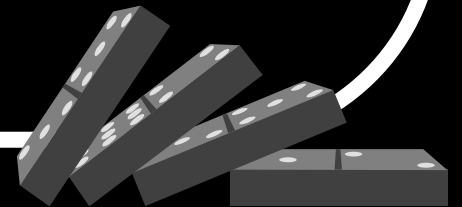
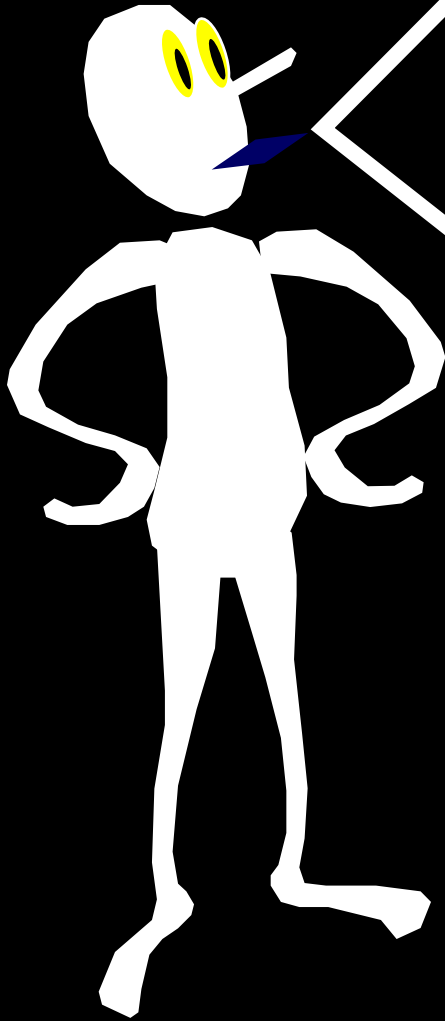
# Theorem?

The sum of the first  $n$  **odd** numbers is  $n^2$

The  $k^{\text{th}}$  odd number is  $(2k - 1)$ , when  $k > 0$

$S_n$  is the statement that:

$$“1+3+5+(2k-1)+\dots+(2n-1) = n^2”$$





# Establishing that $\forall n \geq 1 \ S_n$

$$S_n = "1 + 3 + 5 + (2k-1) + \dots + (2n-1) = n^2"$$

Base Case:  $S_1 = "1 = 1^2"$  ✓

$$\forall k \ S_k \Rightarrow S_{k+1}$$

I.H.  $S_k = "1 + 3 + \dots + (2k-1) = k^2"$

Induction Step.

$$\begin{aligned} S_{k+1} &= \underbrace{1 + 3 + 5 + \dots + (2k-1)}_{k^2} + (2k+1) \\ &= k^2 + (2k+1) \quad \text{by I.H.} \\ &= (k+1)^2 \end{aligned}$$





Establishing that  $\forall n \geq 1 S_n$

$$S_n = "1 + 3 + 5 + (2k-1) + \dots + (2n-1) = n^2"$$



Establishing that  $\forall n \geq 1 S_n$

$$S_n = "1 + 3 + 5 + (2k-1) + \dots + (2n-1) = n^2"$$

**Base Case:**  $S_1$

**Domino Property:**

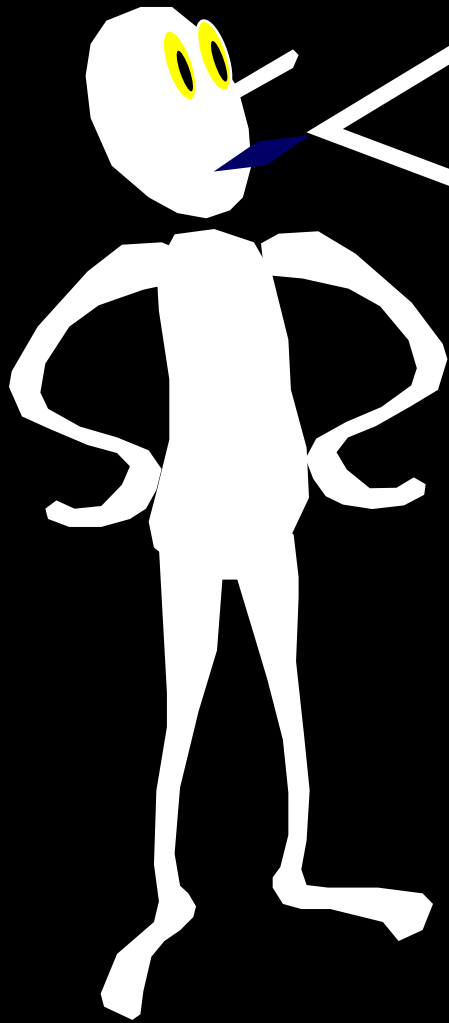
Assume "Induction Hypothesis":  $S_k$

That means:

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

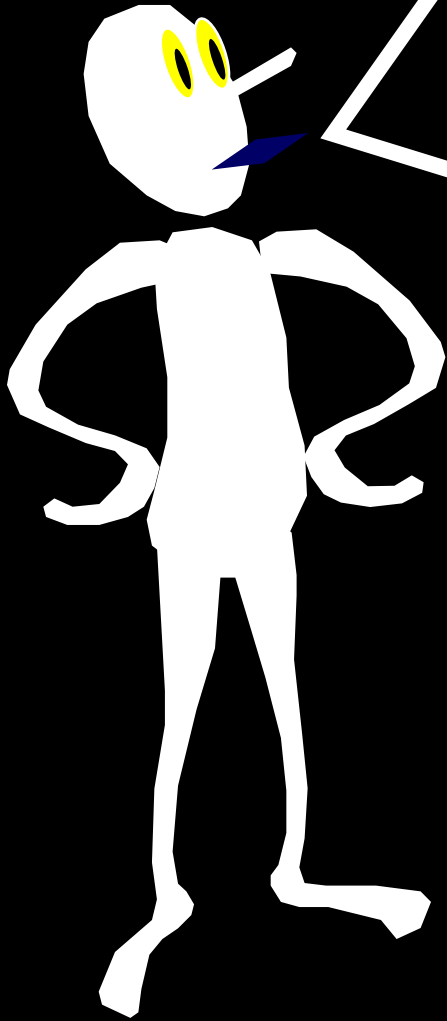
$$1+3+5+\dots+(2k-1)+(2k+1) = k^2+(2k+1)$$

Sum of first  $k+1$  odd numbers  $= (k+1)^2$



## Theorem

The sum of the first  $n$  odd numbers is  $n^2$



## Primes:

A natural number  $n > 1$  is a **prime** if it has no divisors besides 1 and itself

**Note: 1 is not considered prime**

# Theorem?

Every natural number  $> 1$  can be factored into primes

$S_n$  = “ $n$  can be factored into primes”

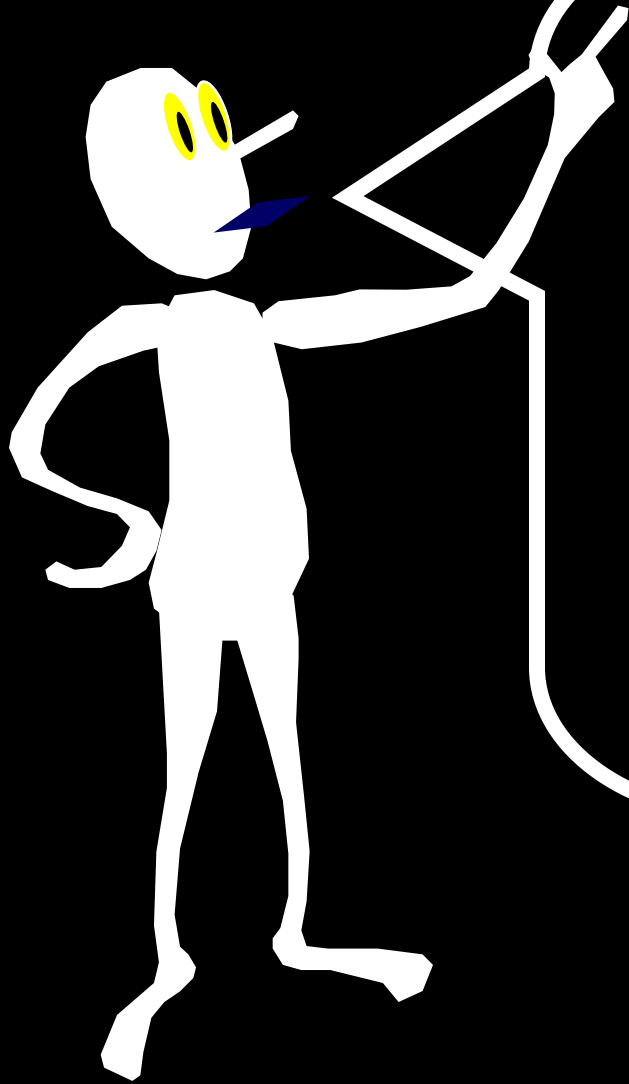
**Base case:**

2 is prime  $\Rightarrow S_2$  is true

How do we use the fact:

$S_{k-1}$  = “ $k-1$  can be factored into primes”  
to prove that:

$S_k$  = “ $k$  can be factored into primes”



This shows a  
technical point  
about  
mathematical  
induction

A different approach:

Assume  $2, 3, \dots, k-1$  **all** can be factored into primes

Then show that  $k$  can be factored into primes

# Theorem?

Every natural number  $> 1$  can be factored into primes

$S_n =$  "n can be written as product of primes"

Base Case:  $S_2$  ✓

I.H.: Suppose  $S_2, S_3, \dots, S_{k-1}$  all true

$S_k$ : either  $k$  is a prime ✓

or  $k = a \cdot b$  with  $a, b < k$

$S_a \Rightarrow a$  can be written as product of primes

$S_b \Rightarrow b$  \_\_\_\_\_

$k =$  can be written as product of primes.





# All Previous Induction

To Prove  $\forall k, S_k$

Establish Base Case:  $S_0$

Establish Domino Effect:

**Assume  $\forall j < k, S_j$**

use that to derive  $S_k$



Also called ion  
“Strong  
Induction”

Establish Domino Effect:

**Assume  $\forall j < k, S_j$**

use that to derive  $S_k$



# “All Previous” Induction Repackaged As Standard Induction

Establish Base  
Case:  $S_0$

Establish  
Domino Effect:

Let  $k$  be any number  
Assume  $\forall j < k, S_j$

Prove  $S_k$

**Define  $T_i = \forall j \leq i, S_j$**

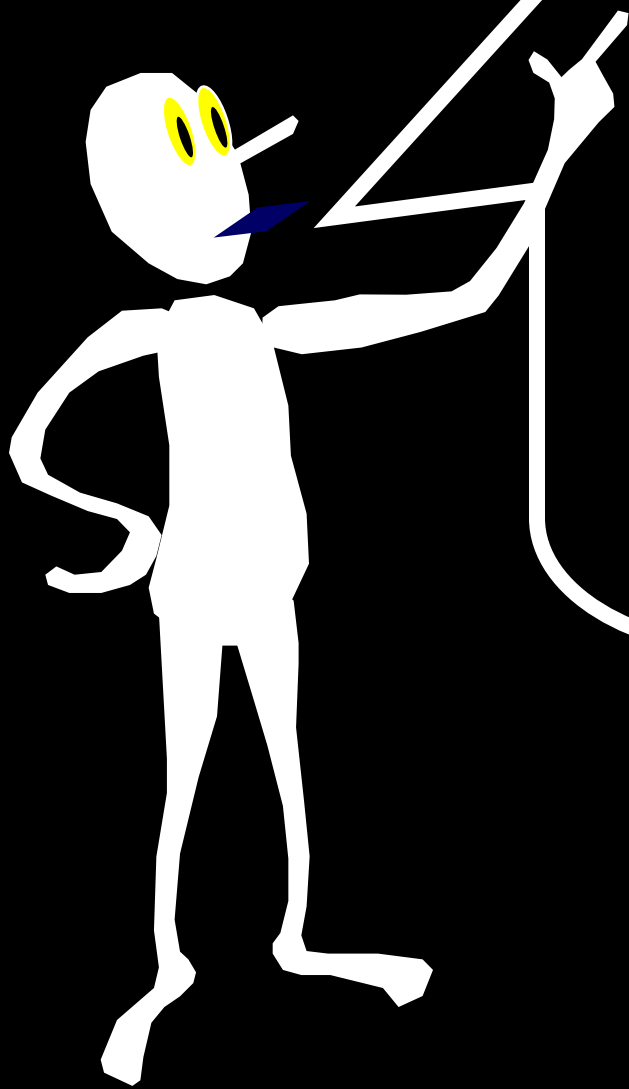
Establish Base  
Case  $T_0$

Establish that

$\forall k, T_k \Rightarrow T_{k+1}$

Let  $k$  be any number  
Assume  $T_{k-1}$

Prove  $T_k$



And there are  
more ways to do  
inductive proofs

# Method of Infinite Descent



Pierre de Fermat

$$x^3 + y^3 = z^3$$

$$x^4 + y^4 = z^4 \quad x^n + y^n = z^n$$

Show that for any  
counter-example  
you find a smaller one

If a counter-example exists  
there would be an  
infinite sequence of  
smaller and smaller  
counter-examples

# Theorem:

Every natural number  $> 1$  can be factored into primes

Let  $n$  be a counter-example

Hence  $n$  is not prime, so  $n = ab$

If both  $a$  and  $b$  had prime factorizations, then  $n$  would too

Thus  $a$  or  $b$  is a smaller counter-example

# Theorem:

Every natural number  $> 1$  can be factored into primes

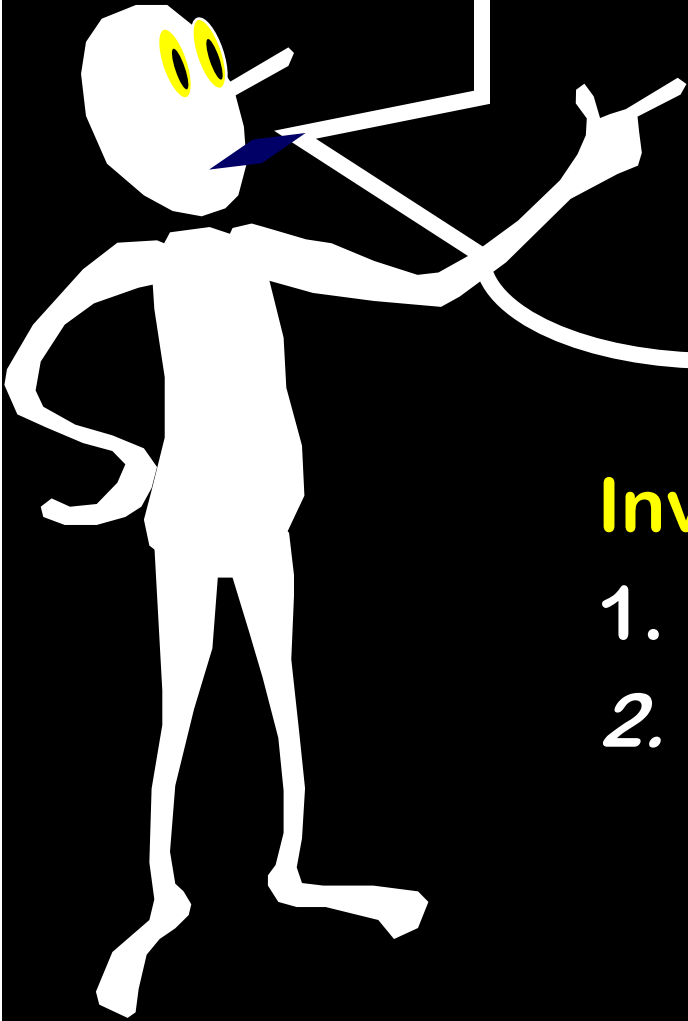
Let  $n$  be <sup>the smallest / least</sup> ~~a~~ counter-example

Hence  $n$  is not prime, so  $n = ab$

If both  $a$  and  $b$  had prime factorizations, then  $n$  would too

Thus  $a$  or  $b$  is a smaller counter-example

$\Rightarrow$  contradiction



Yet another way of  
packaging inductive  
reasoning is to define  
“invariants”

**Invariant (n):**

1. Not varying; constant.
2. *Mathematics.* Unaffected by a designated operation, as a transformation of coordinates.



## Invariant (n):

3. *Programming.* A rule, such as the ordering of an ordered list, that applies throughout the life of a data structure or procedure. Each change to the data structure maintains the correctness of the invariant



# Invariant Induction

Suppose we have a time varying world state:  $W_0, W_1, W_2, \dots$

Each state change is assumed to come from a list of permissible operations. We seek to prove that statement  $S$  is true of all future worlds

Argue that  $S$  is true of the initial world

Show that if  $S$  is true of some world – then  $S$  remains true after one permissible operation is performed

# Odd/Even Handshaking Theorem

At any party at any point in time define a person's **parity** as ODD/EVEN according to the number of hands they have shaken

## **Statement:**

The number of people of odd parity must be even

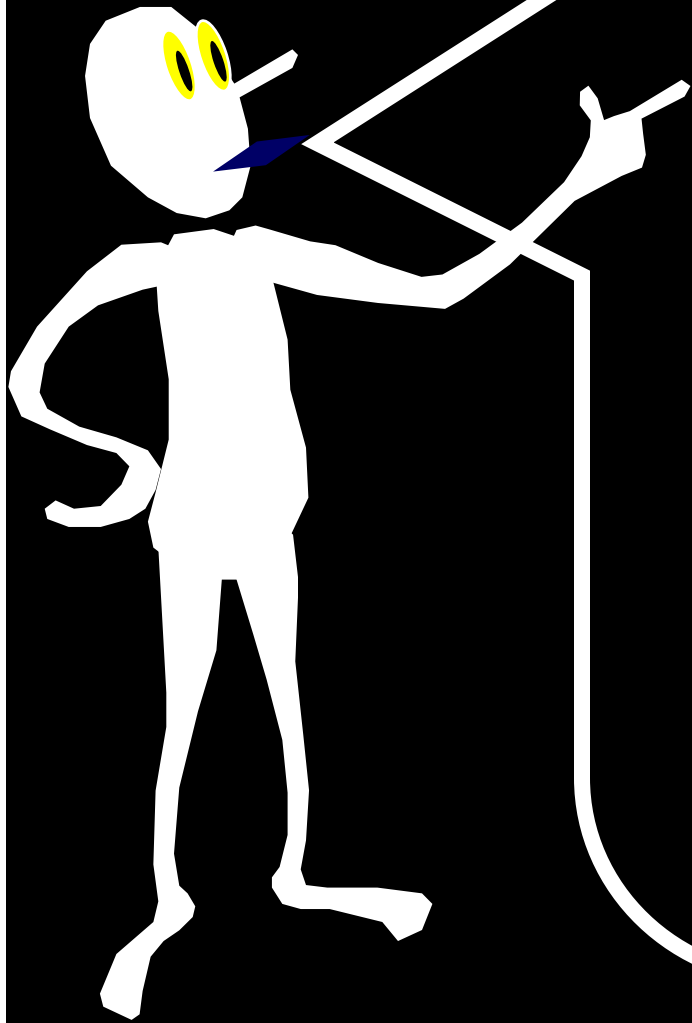
**Statement:** The number of people of odd parity must be even

**Initial case:** Zero hands have been shaken at the start of a party, so zero people have odd parity

**Invariant Argument:**

If 2 people of the same parity shake, they both change and hence the odd parity count changes by 2 – and remains even

If 2 people of different parities shake, then they both swap parities and the odd parity count is unchanged



**Inductive reasoning  
is the high level idea**

**“Standard” Induction**

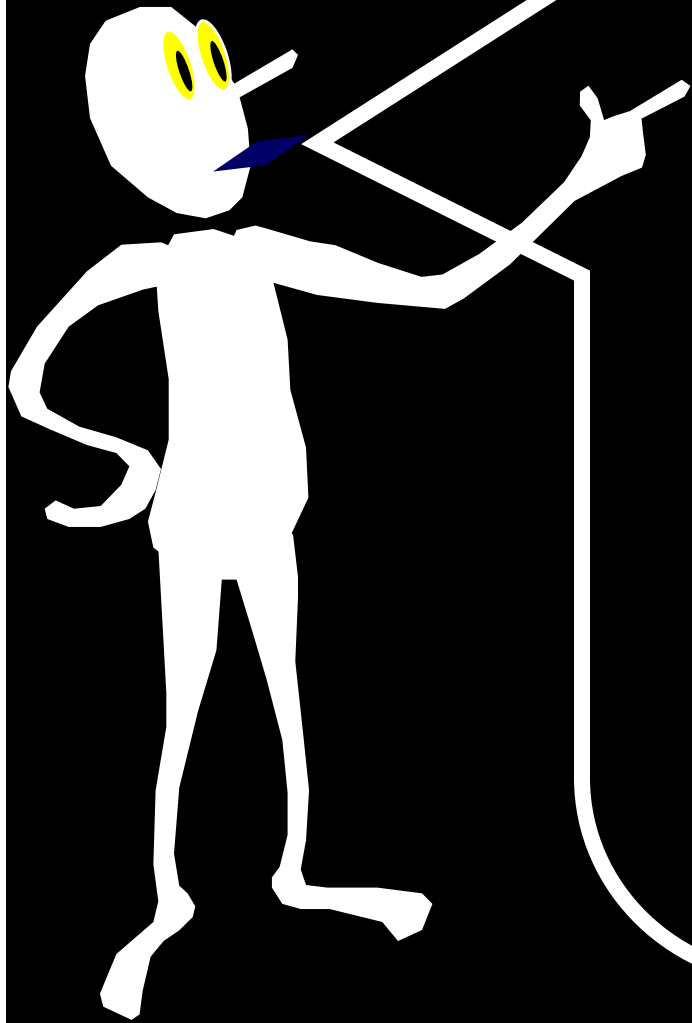
**“All Previous” Induction**

**“Least Counter-example”**

**“Invariants”**

**all just**

**different packaging**



**Induction is also how we  
can define and construct  
our world**

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



# Inductive Definition

## Example

**Initial Condition, or Base Case:**

$$F(0) = 1$$

Inductive definition of  
the powers of 2!

**Inductive Rule:**

$$\text{For } n > 0, F(n) = F(n-1) + F(n-1)$$

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

# Leonardo Fibonacci

In 1202, Fibonacci proposed a problem about the growth of rabbit populations





# Rabbit Reproduction

A rabbit lives forever

The population starts as single newborn pair

Every month, each productive pair begets a new pair which will become productive when they are 2 months old

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

month	1	2	3	4	5	6	7
rabbits	1	1	2	3	5	8	13



# Fibonacci Numbers

month	1	2	3	4	5	6	7
rabbits	1	1	2	3	5	8	13

**Stage 0, Initial Condition, or Base Case:**

$$\text{Fib}(1) = 1; \text{Fib}(2) = 1$$

**Inductive Rule:**

$$\text{For } n > 3, \text{Fib}(n) = \text{Fib}(n-1) + \text{Fib}(n-2)$$

# Recurrences

# Example

$$T(1) = 1$$

$$T(n) = 4T(n/2) + n$$

Notice that  $T(n)$  is inductively defined only for positive powers of 2, and undefined on other values

$$T(1) = 1 \quad T(2) = 6 \quad T(4) = 28 \quad T(8) = 120$$

Guess a closed-form formula for  $T(n)$

$$\text{Guess: } G(n) = 2n^2 - n$$

# Inductive Proof of Equivalence

$$G(n) = 2n^2 - n$$

$$T(1) = 1$$

$$T(n) = 4T(n/2) + n$$

# Inductive Proof of Equivalence

**Base Case:**  $G(1) = 1$  and  $T(1) = 1$

**Induction Hypothesis:**

$$T(x) = G(x) \text{ for } x < n$$

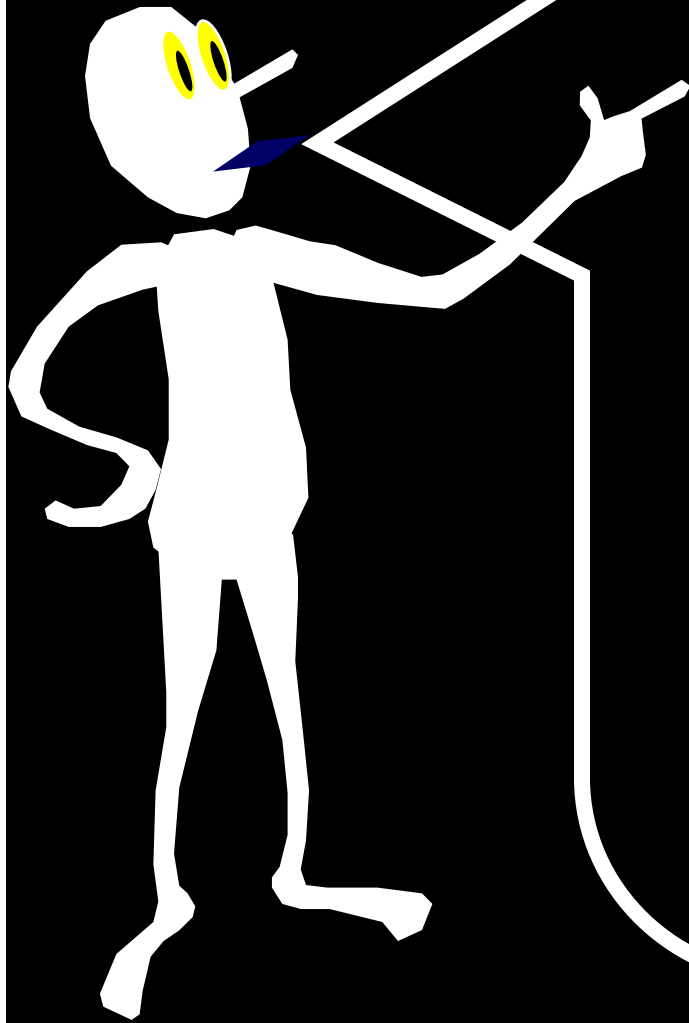
**Hence:**  $T(n/2) = G(n/2) = 2(n/2)^2 - n/2$

$$\begin{aligned} T(n) &= 4 T(n/2) + n \\ &= 4 G(n/2) + n \\ &= 4 [2(n/2)^2 - n/2] + n \\ &= 2n^2 - 2n + n \\ &= 2n^2 - n \\ &= G(n) \end{aligned}$$

$$G(n) = 2n^2 - n$$

$$T(1) = 1$$

$$T(n) = 4T(n/2) + n$$



We inductively  
proved the assertion  
that  $G(n) = T(n)$

Giving a formula for  
 $T$  with no  
recurrences is  
called “solving the  
recurrence for  $T$ ”

# Technique 2

## Guess Form, Calculate Coefficients

$$T(1) = 1, T(n) = 4 T(n/2) + n$$

**Guess:**  $T(n) = an^2 + bn + c$

for some  $a, b, c$



# Technique 2

## Guess Form, Calculate Coefficients

$$T(1) = 1, T(n) = 4 T(n/2) + n$$

**Guess:**  $T(n) = an^2 + bn + c$

for some  $a, b, c$

**Calculate:**  $T(1) = 1$ , so  $a + b + c = 1$

$$T(n) = 2n^2 - 1 \cdot n$$

$$T(n) = 4 T(n/2) + n$$

$$an^2 + bn + c = 4 [a(n/2)^2 + b(n/2) + c] + n$$

$$= an^2 + 2bn + 4c + n$$

$$(b+1)n + 3c = 0$$

**Therefore:**  $b = -1$     $c = 0$     $a = 2$

# **Inductive Definitions: some examples**

# The Lindenmayer Game

**Alphabet:** {a,b}

**Start word:** a

**Productions Rules:**

$\text{Sub}(a) = ab$

$\text{Sub}(b) = a$

$\text{NEXT}(w_1 w_2 \dots w_n) =$   
 $\text{Sub}(w_1) \text{Sub}(w_2) \dots \text{Sub}(w_n)$

Time 1: a

Time 2: ab

Time 3: aba

Time 4: abaab

Time 5: abaababa

**How long are the  
strings at time n?**

**FIBONACCI(n)**

# Aristid Lindenmayer (1925-1989)

- 1968 Invents L-systems in Theoretical Botany

Time 1: a

Time 2: ab

Time 3: aba

Time 4: abaab

Time 5: abaababa



Aristid Lindenmayer 1925-1989

# The Koch Game

- **Alphabet:**  $\Sigma = \{ F, +, - \}$
- **Start word:** F
- **Production Rules:**
  - $\text{Sub}(F) = F+F--F+F$
  - $\text{Sub}(+) = +$
  - $\text{Sub}(-) = -$
- **NEXT**( $w_1 w_2 \dots w_n$ ) =  $\text{Sub}(w_1) \text{Sub}(w_2) \dots \text{Sub}(w_n)$



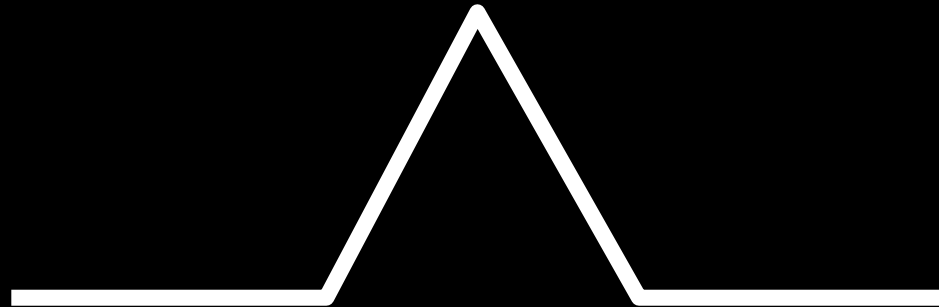
Helge von Koch

**Gen 0:** F

**Gen 1:** F+F--F+F

**Gen 2:** F+F--F+F+F+F--F+F--F+F--F+F+F+F--F+F

# The Koch Game

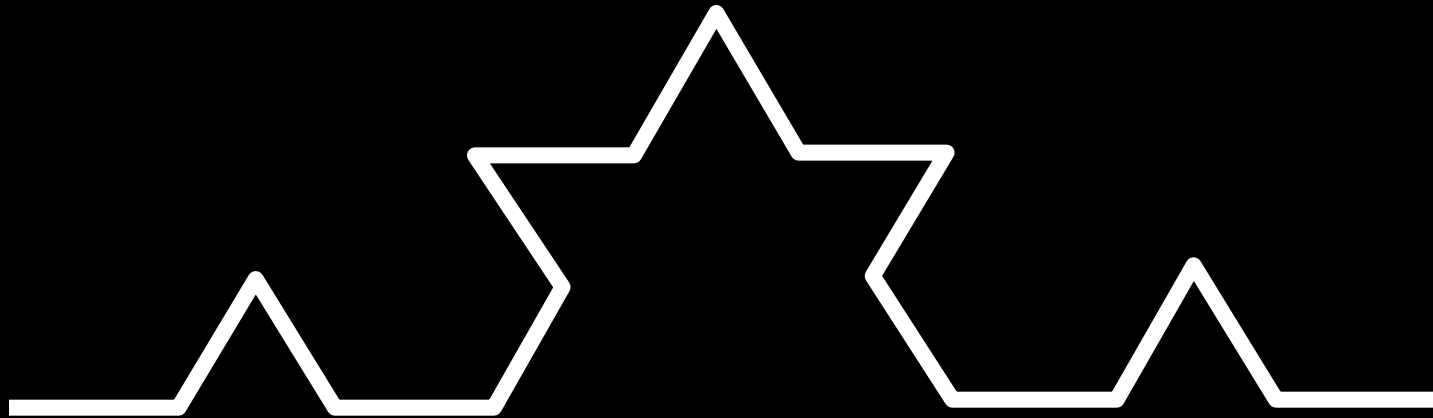


F+F--F+F

## Visual representation:

- F draw forward one unit
- + turn 60 degree left
- turn 60 degrees right

# The Koch Game

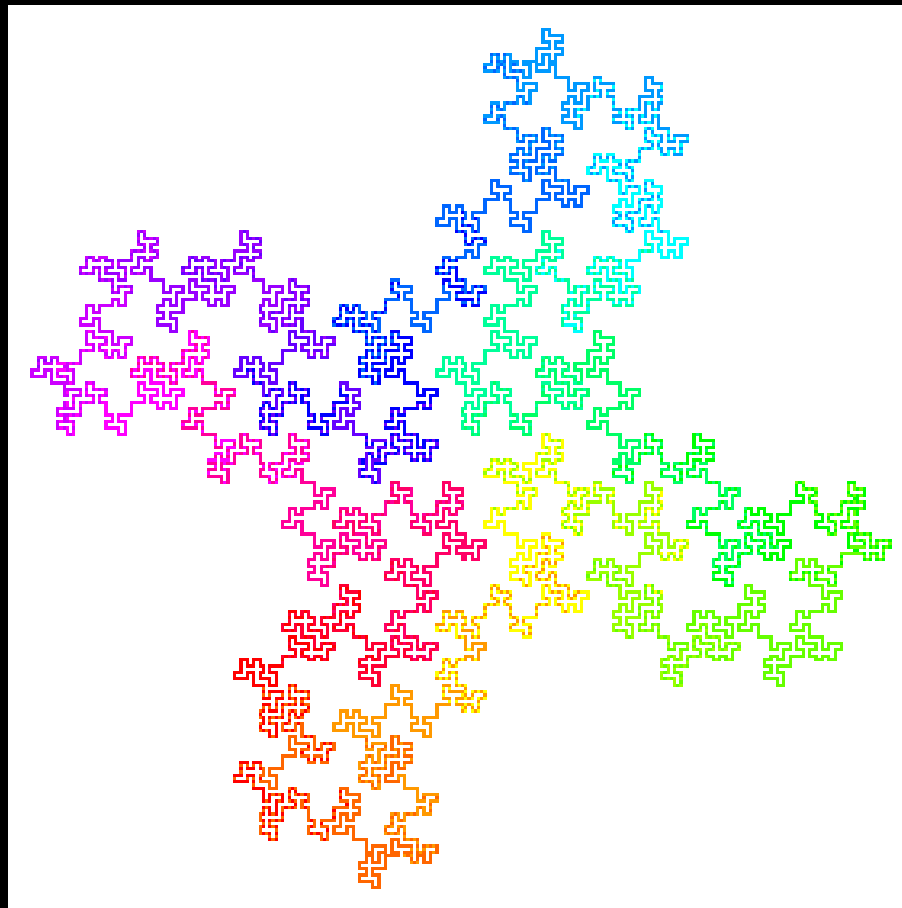


F+F--F+F+F+F--F+F--F+F--F+F+F+F+F--F+F

## Visual representation:

- F draw forward one unit
- + turn 60 degree left
- turn 60 degrees right

# Koch Curve

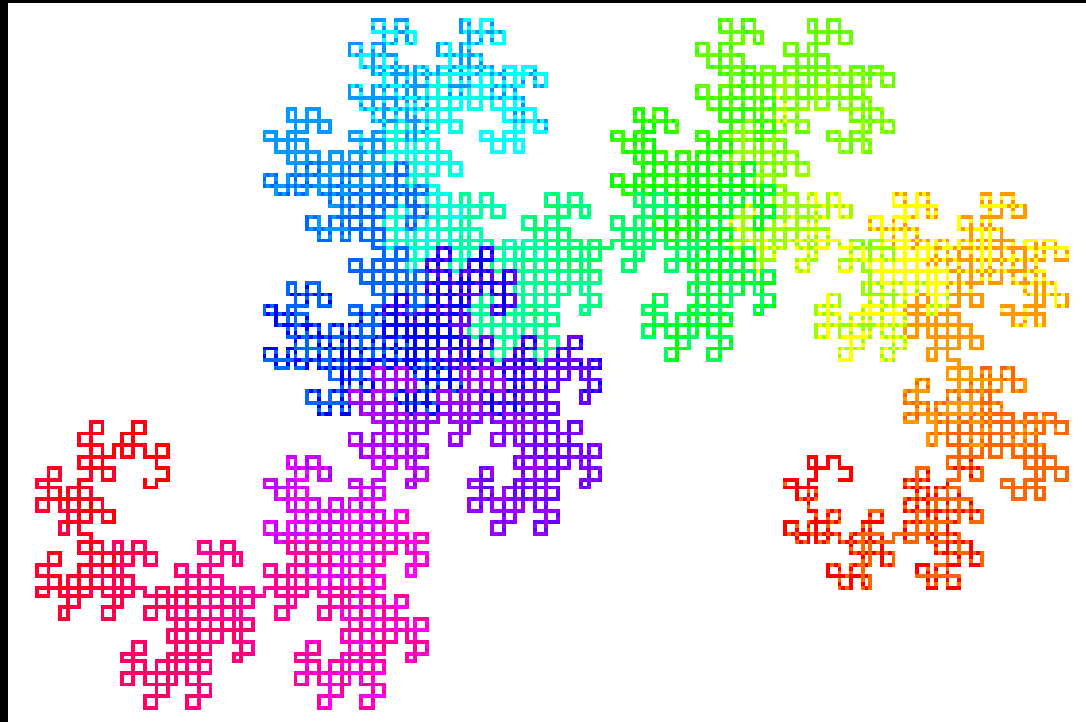




# Dragon Game

$$\text{Sub}(X) = X + YF +$$

$$\text{Sub}(Y) = -FX - Y$$



Dragon Curve

# Hilbert Game

Sub(L)= +RF-LFL-FR+

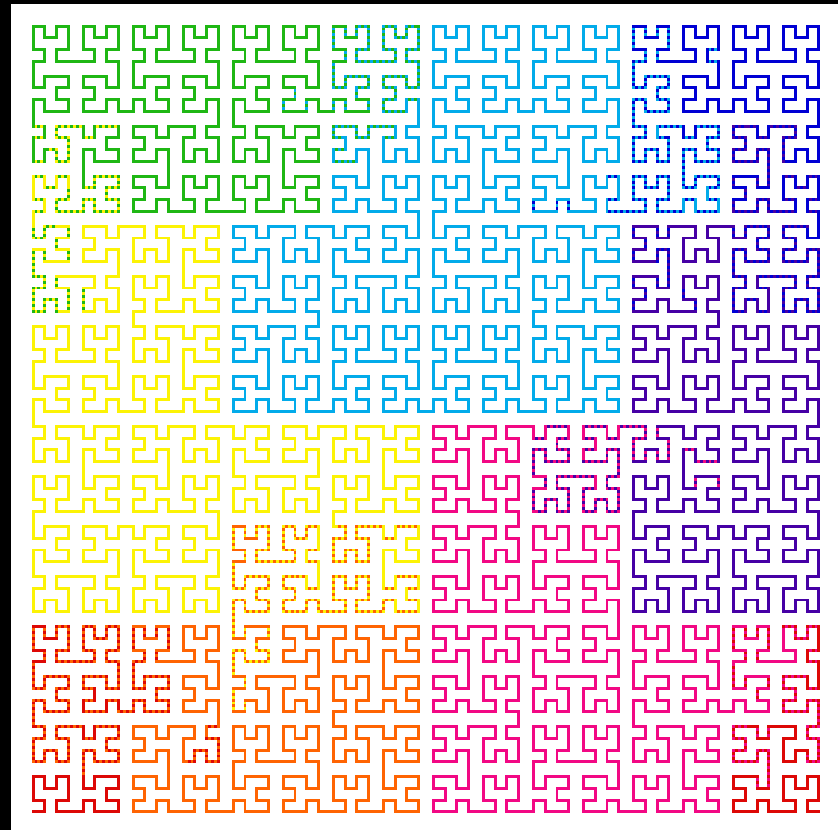
Sub(R)= -LF+RFR+FL-

Make 90 degree turns  
instead of 60 degrees.

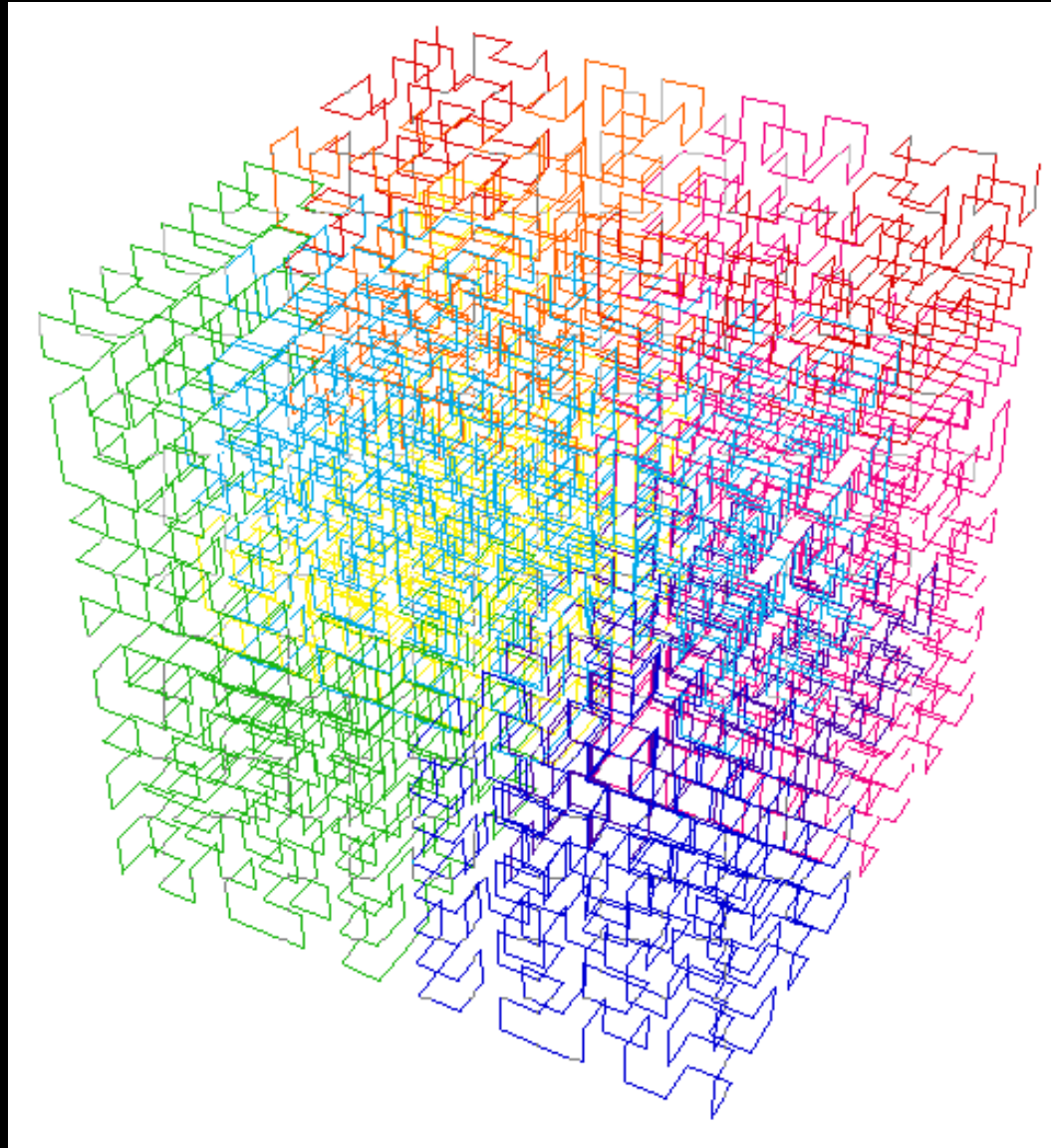


*Hilbert*

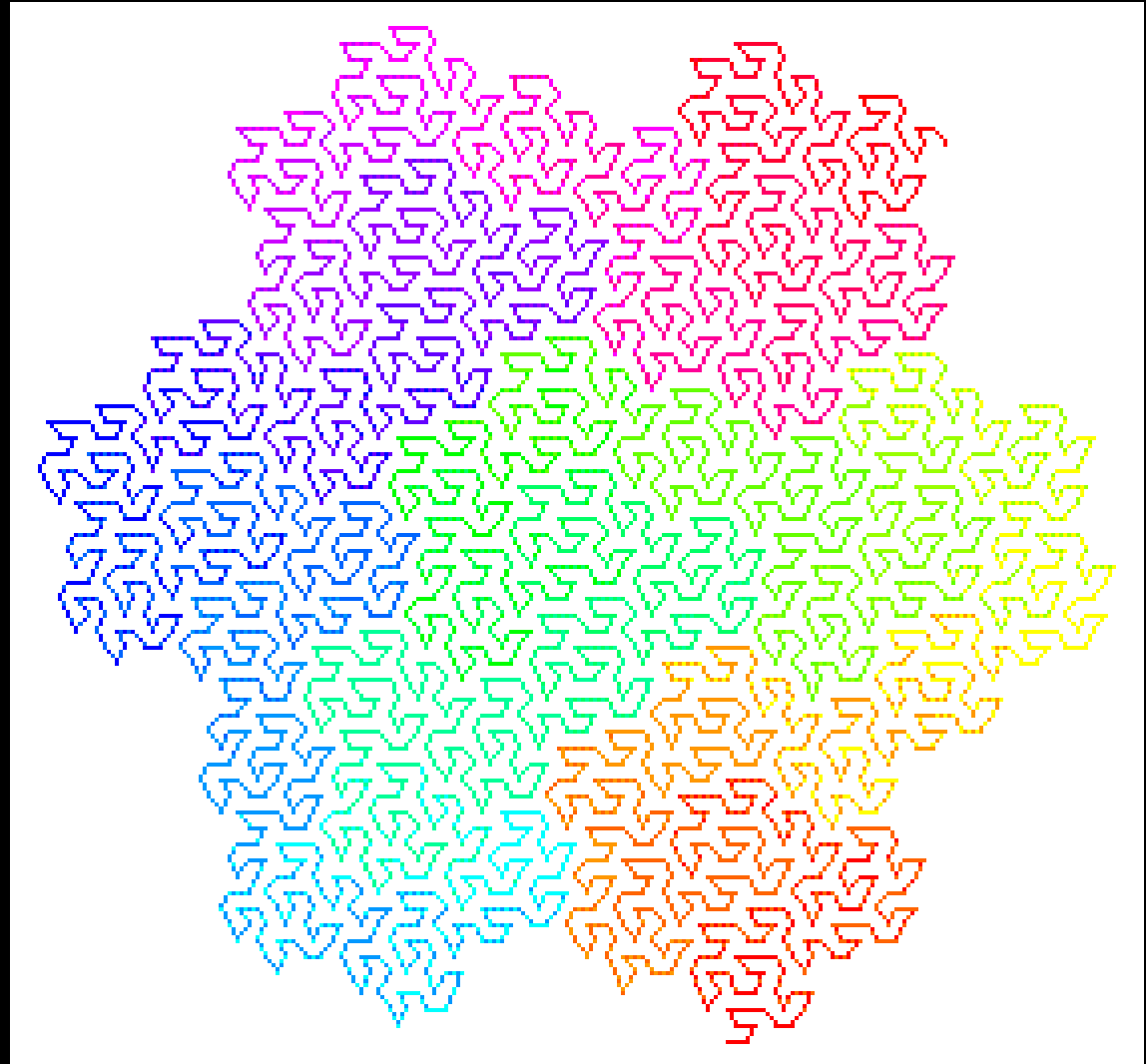
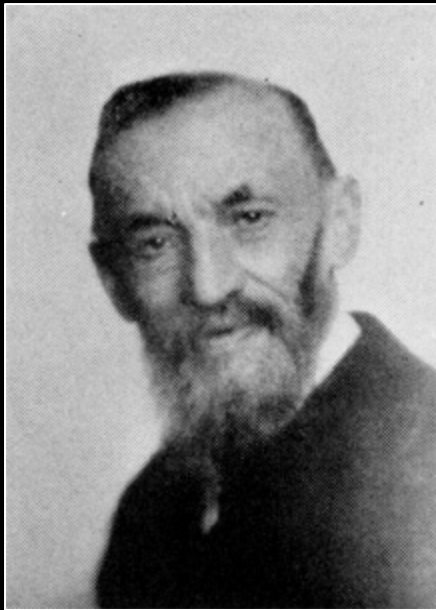
## Hilbert Curve



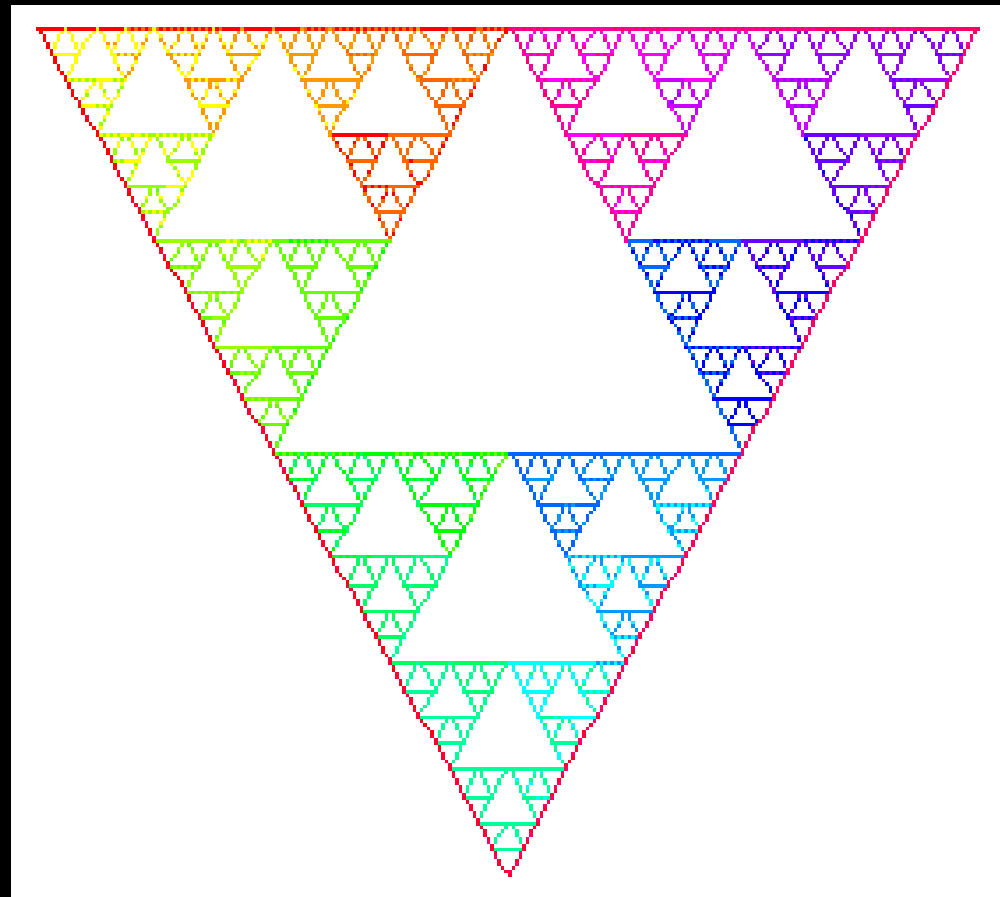
# Hilbert's space filling curve



# Peano's gossamer curve



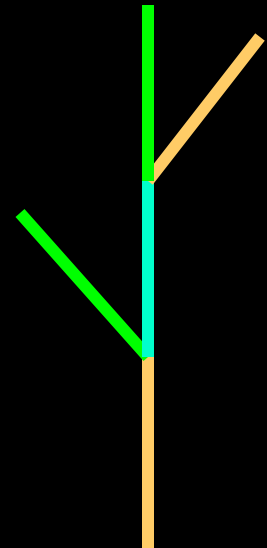
# Sierpinski's triangle



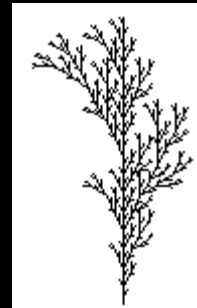
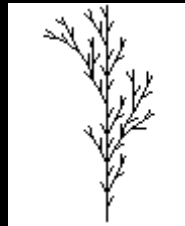
# Lindenmayer 1968

$\text{Sub}(F) = F[-F]F[+F][F]$

Interpret the stuff inside  
brackets as a branch.



# Lindenmayer 1968



# Inductive Leaf



“The Algorithmic Beauty of Plants”



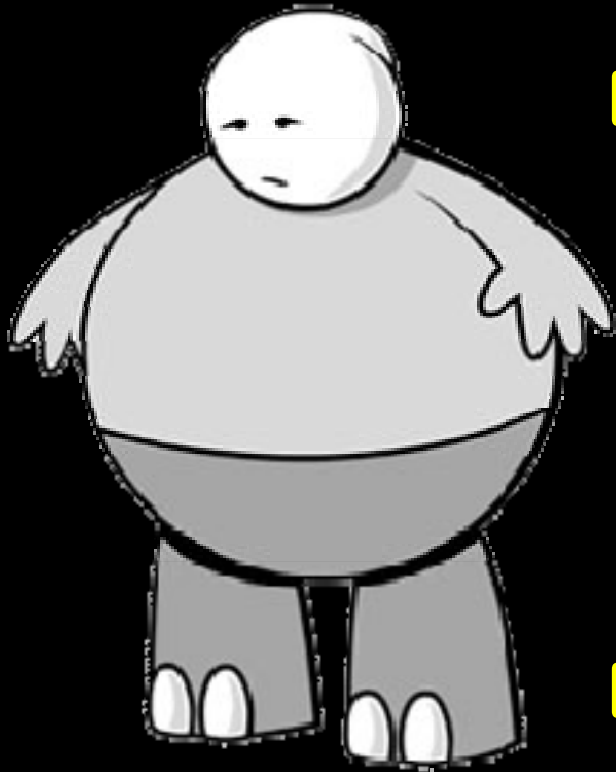
- Start at X  
Sub(X) = F-[[X]+X]+F[+FX]-X  
Sub(F) = FF
- Angle=22.5





# Much more stuff at

- <http://www.cbc.yale.edu/courseware/swinglsystem.html>



Here's What  
You Need to  
Know...

## Inductive Proof

Standard Form

All Previous Form

Least-Counter Example Form

Invariant Form

## Inductive Definition

Recurrence Relations

Fibonacci Numbers

Guess and Verify