

# 15-251

Some **AWESOME**

~~Great Theoretical Ideas~~

~~in Computer Science~~

about ~~Generating Functions~~

Probability

# 15-251

Some **AWESOME**

~~Great Theoretical Ideas~~

~~in Computer Science~~

about ~~Generating Functions~~

~~Probability~~  
Infinity

**15-251**

**What Little Susie  
Should've Said to Little  
Johnny**

# Ideas from the course

Induction

Numbers

Finite Counting and Probability

**A hint of the infinite**

Infinite row of dominoes

Infinite sums (Generating functions!!)

Infinite choice trees, and infinite  
probability

Infinite tapes

**The Ideal Computer:  
no bound on amount of memory  
no bound on amount of time**

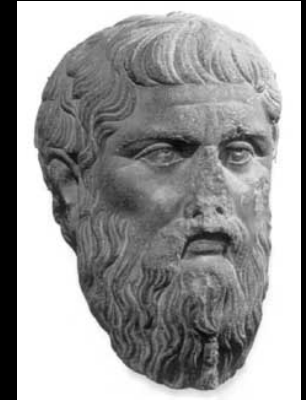
Ideal Computer is defined as a  
computer with infinite RAM.

You can run a Java program and never have  
any overflow, or out of memory errors.

# Infinite RAM Model

## Platonic Version:

One memory location for each natural number  $0, 1, 2, \dots$



## Aristotelian Version:

Whenever you run out of memory, the computer contacts the factory. A maintenance person is flown by helicopter and attaches 1000 Gig of RAM and all programs resume their computations, as if they had never been interrupted.



# Here's a program

```
System.out.print("0.");  
for(int i=0;true;i++)  
{  
    System.out.print( getDigit(i) );  
}
```

# Here's a program

```
int getDigit(int i)
{
    return 3;
}
```



# Here's a program

```
int getDigit(int i)
{
    return i%10;
}
```

# Here's a program

Can we do:

Pi?

e?

Any real?

$$\frac{1}{\pi} = 12 \sum_{k=0}^{\infty} \frac{(-1)^k (6k)! (13591409 + 545140134k)}{(3k)! (k!)^3 640320^{3k+3/2}}$$



**Chudnovsky  
brothers**



# An Ideal Computer

It can be programmed to print out:

2: 2.000000000000000000000000000000...

1/3: 0.333333333333333333333333333333...

$\phi$ : 1.6180339887498948482045...

e: 2.7182818284590452353602...

$\pi$ : 3.14159265358979323846264...

# Printing Out An Infinite Sequence..

A program **P** prints out the infinite sequence

$s_0, s_1, s_2, \dots, s_k, \dots$

if when **P** is executed on an ideal computer, it outputs a sequence of symbols such that

-The  $k^{\text{th}}$  symbol that it outputs is  $s_k$

-For every  $k$ , **P** eventually outputs the  $k^{\text{th}}$  symbol.  
I.e., the delay between symbol  $k$  and symbol  $k+1$  is not infinite.

# Computable Real Numbers

A real number  $R$  is computable if there is a program that prints out the decimal representation of  $R$  from left to right.

Thus, each digit of  $R$  will eventually be output.



Are all real numbers  
computable?

# Describable Numbers

A real number  $R$  is describable if it can be denoted unambiguously by a finite piece of English text.

2: “Two.”

$\pi$ : “The area of a circle of radius one.”

Are all real numbers  
describable?



Is every  
**computable real number**,  
also a **describable real  
number**?

And what about the other  
way?

**Computable R**: some program outputs R  
**Describable R**: some sentence denotes R





# Computable $\Rightarrow$ describable

**Theorem:**

Every computable real is also describable

# Computable $\Rightarrow$ describable

## Theorem:

Every computable real is also describable

## Proof:

Let  $R$  be a computable real that is output by a program  $P$ . The following is an unambiguous description of  $R$ :

**“The real number output by the following program:”  $P$**

**MORAL: A computer program can be viewed as a description of its output.**

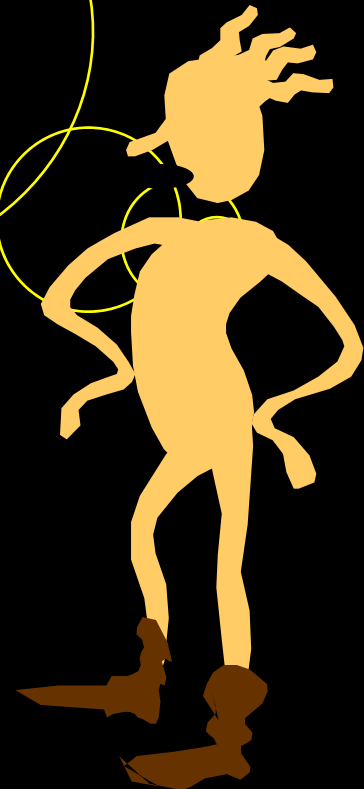
**Syntax: The text of the program**  
**Semantics: The real number output by P**



**Are all reals describable?  
Are all reals computable?**

**We saw that  
computable  $\Rightarrow$   
describable,  
but do we also have  
describable  $\Rightarrow$   
computable?**

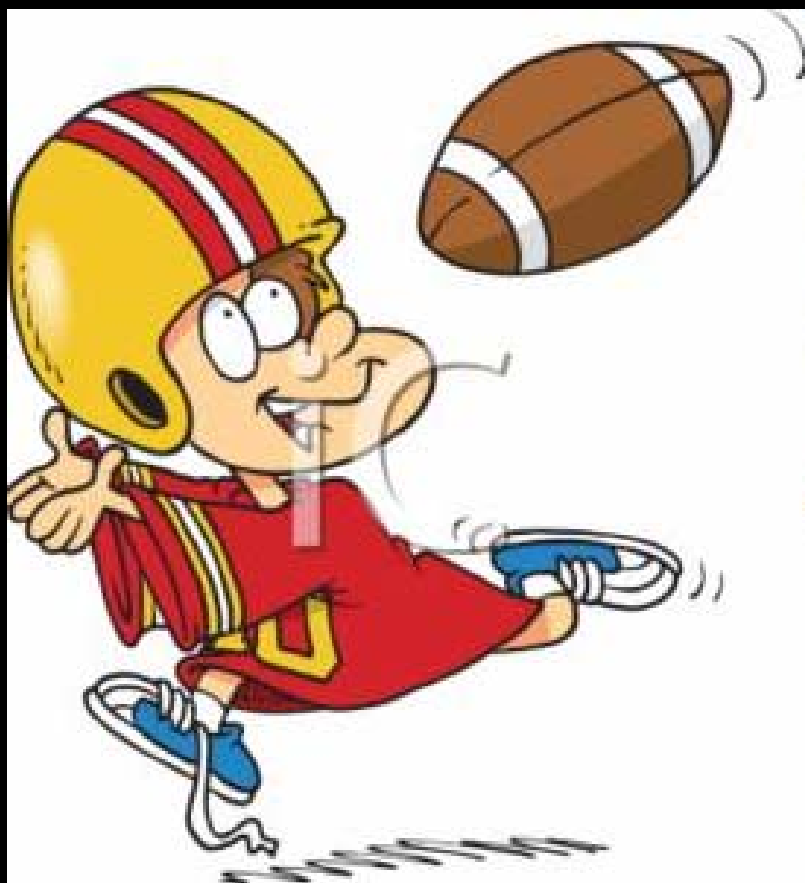
**Questions we will answer in this (and next) lecture...**



# Little Susie



# Little Johnny



# Little Susie and Little Johnny

Little Susie: I hate you

Little Johnny: I hate you more

Little Susie: I hate you times **a zillion**

Little Johnny: I hate you times **infinity**

Little Susie: I hate you times **infinity**

**Plus one!**

# Susie's mistake

Infinity:  $\mathbb{N}$ .

Infinity plus one :  $\mathbb{N} \cup \{\text{cupcake}\}$

Can we establish a bijection between  $\mathbb{N}$  and  $\mathbb{N} \cup \{\text{cupcake}\}$ ?



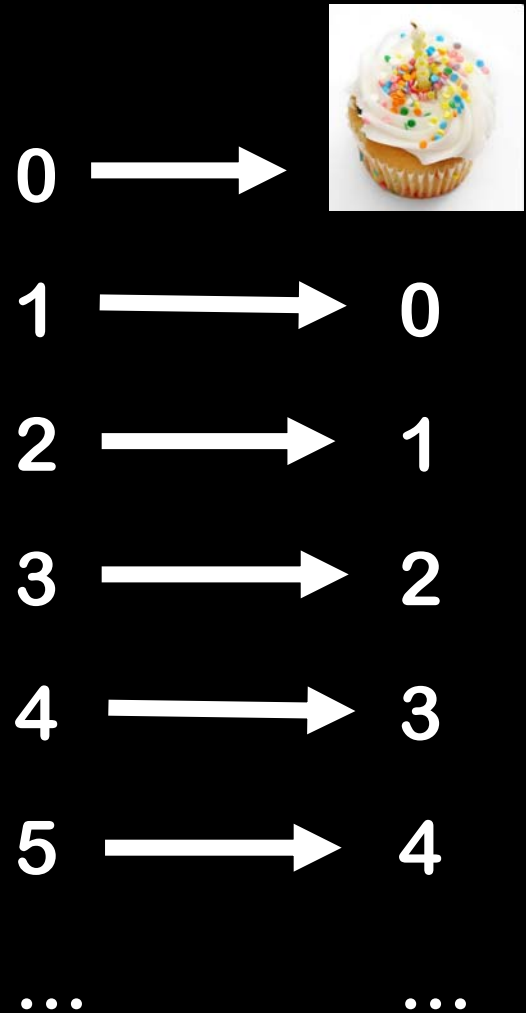
# Susie's mistake

Sure!

$f : \mathbb{N} \rightarrow \mathbb{N} \cup \{\text{cupcake}\}$

$f(x) = \text{cupcake}$  if  $x=0$

$f(x) = x-1$  if  $x>0$



# Correspondence Principle

If two finite sets can be placed into **1-1 onto correspondence**, then they have the same size.

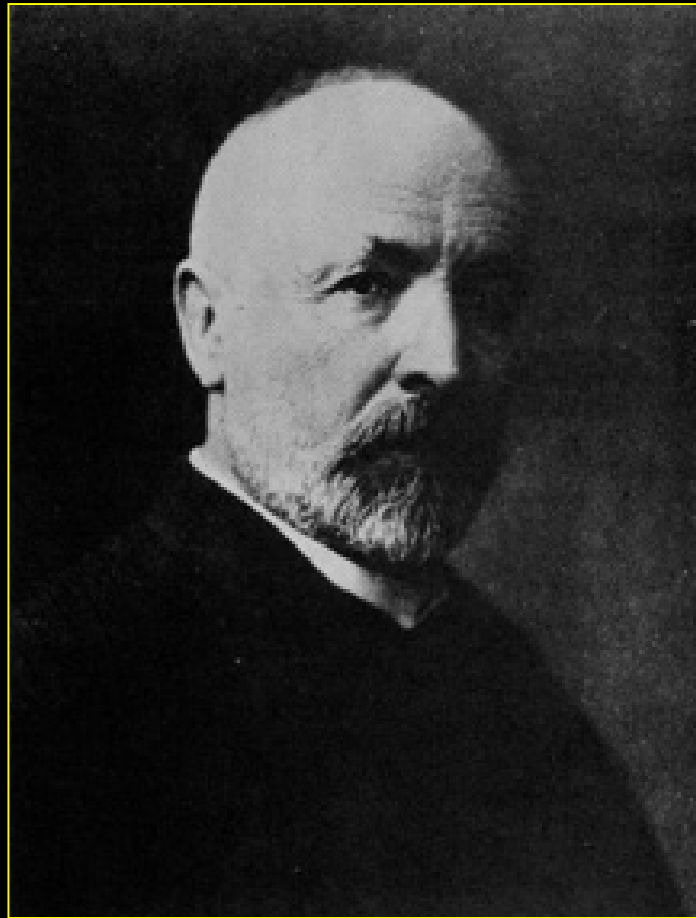
That is, if there exists a **bijection** between them.

# Correspondence Definition

In fact, we can use the correspondence as the definition:

**Two finite sets are defined to have the same size if and only if they can be placed into 1-1 onto correspondence.**

# Georg Cantor (1845-1918)



# Cantor's Definition (1874)

Two sets are defined to have the same size if and only if they can be placed into 1-1 onto correspondence.

# Cantor's Definition (1874)

Two sets are defined to have the same cardinality if and only if they can be placed into 1-1 onto correspondence.

Therefore,  $N$  and  $N \cup \{\text{cupcake}\}$  have the same cardinality.

**Do N and E have the same cardinality?**

**$N = \{ 0, 1, 2, 3, 4, 5, 6, 7, \dots \}$**

**$E = \{ 0, 2, 4, 6, 8, 10, 12, \dots \}$**

**The even, natural numbers.**

E and N do not have the same cardinality! E is a proper subset of N with not one element left over, but an INFINITE amount!





E and N do have the  
same cardinality!

$N = 0, 1, 2, 3, 4, 5, \dots$

$E = 0, 2, 4, 6, 8, 10, \dots$

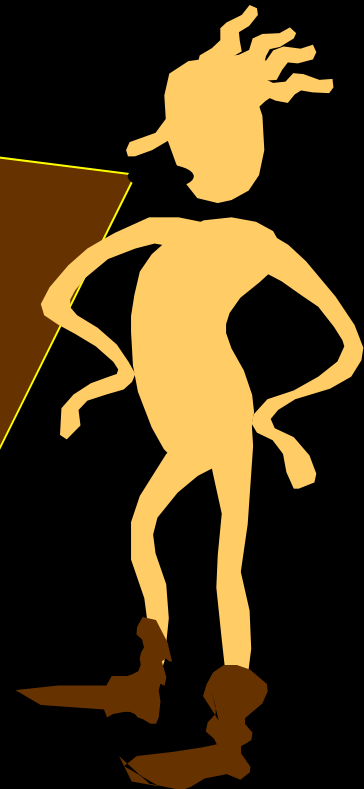
$f(x) = 2x$  is 1-1 onto.



## Lesson:

Cantor's definition only requires that *some* 1-1 correspondence between the two sets is onto, not that *all* 1-1 correspondences are onto.

This distinction never arises when the sets are *finite*.



# Cantor's Definition (1874)

Two sets are defined to have the same size if and only if they can be placed into 1-1 onto correspondence.

You just have to get used to this slight subtlety in order to argue about infinite sets!



**Do  $\mathbb{N}$  and  $\mathbb{Z}$  have the same cardinality?**

$$\mathbb{N} = \{ 0, 1, 2, 3, 4, 5, 6, 7, \dots \}$$

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

No way!  $\mathbb{Z}$  is infinite in two ways: from 0 to positive infinity and from 0 to negative infinity.

Therefore, there are far more integers than naturals.



Actually, no!

**N and Z do have the same  
cardinality!**

**$N = 0, 1, 2, 3, 4, 5, 6 \dots$**

**$Z = 0, 1, -1, 2, -2, 3, -3, \dots$**

**$f(x) = \begin{cases} \lceil x/2 \rceil & \text{if } x \text{ is odd} \\ -x/2 & \text{if } x \text{ is even} \end{cases}$**



# Transitivity Lemma

Do  $E$  and  $Z$  have the same cardinality?



# Transitivity Lemma

**Lemma:** If

**$f: A \rightarrow B$**  is 1-1 onto, and

**$g: B \rightarrow C$**  is 1-1 onto.

Then  $h(x) = g(f(x))$  defines a function

**$h: A \rightarrow C$**  that is 1-1 onto

Hence,  $\mathbb{N}$ ,  $\mathbb{E}$ , and  $\mathbb{Z}$  all have the same cardinality.

**Do N and Q have the same cardinality?**

**$N = \{ 0, 1, 2, 3, 4, 5, 6, 7, \dots \}$**

**Q = The Rational Numbers**

No way!

The rationals are dense: between any two there is a third. You can't list them one by one without leaving out an infinite number of them.



**Don't jump to conclusions!**

**There is a clever way to list  
the rationals, one at a time,  
without missing a single  
one!**



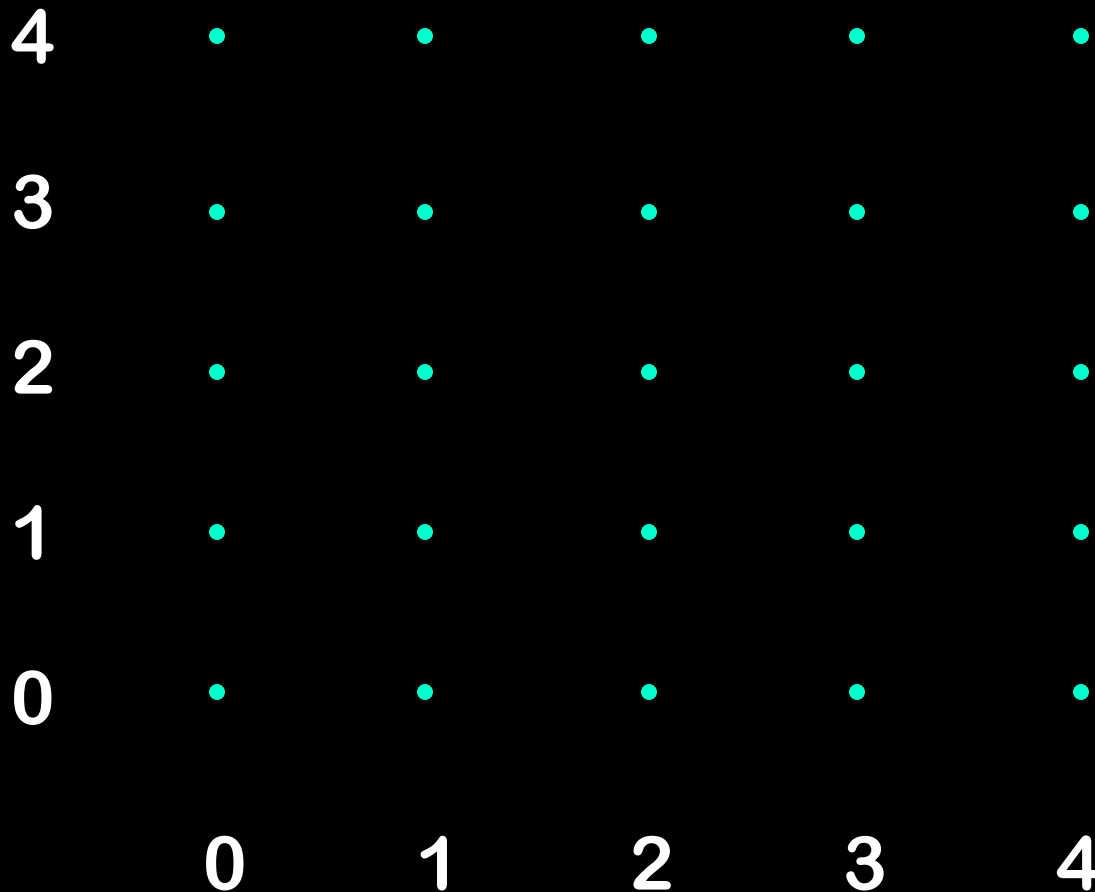
First, let's warm up  
with another  
interesting example:  
N can be paired with  
 $N \times N$



**Theorem:  $\mathbb{N}$  and  $\mathbb{N} \times \mathbb{N}$  have the same cardinality**

# Theorem: $\mathbb{N}$ and $\mathbb{N} \times \mathbb{N}$ have the same cardinality

...

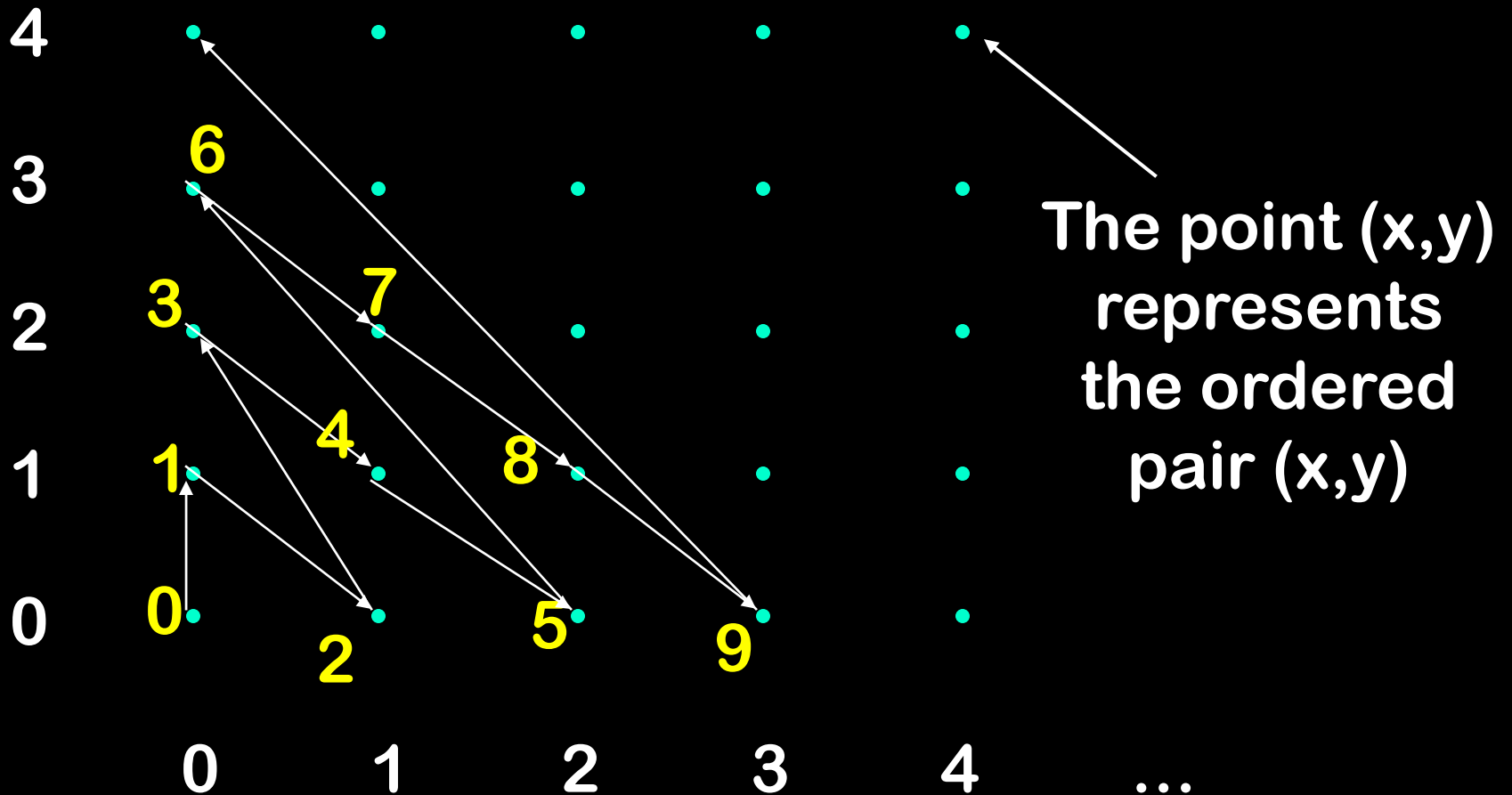


The point  $(x,y)$   
represents  
the ordered  
pair  $(x,y)$

...

# Theorem: $\mathbb{N}$ and $\mathbb{N} \times \mathbb{N}$ have the same cardinality

...



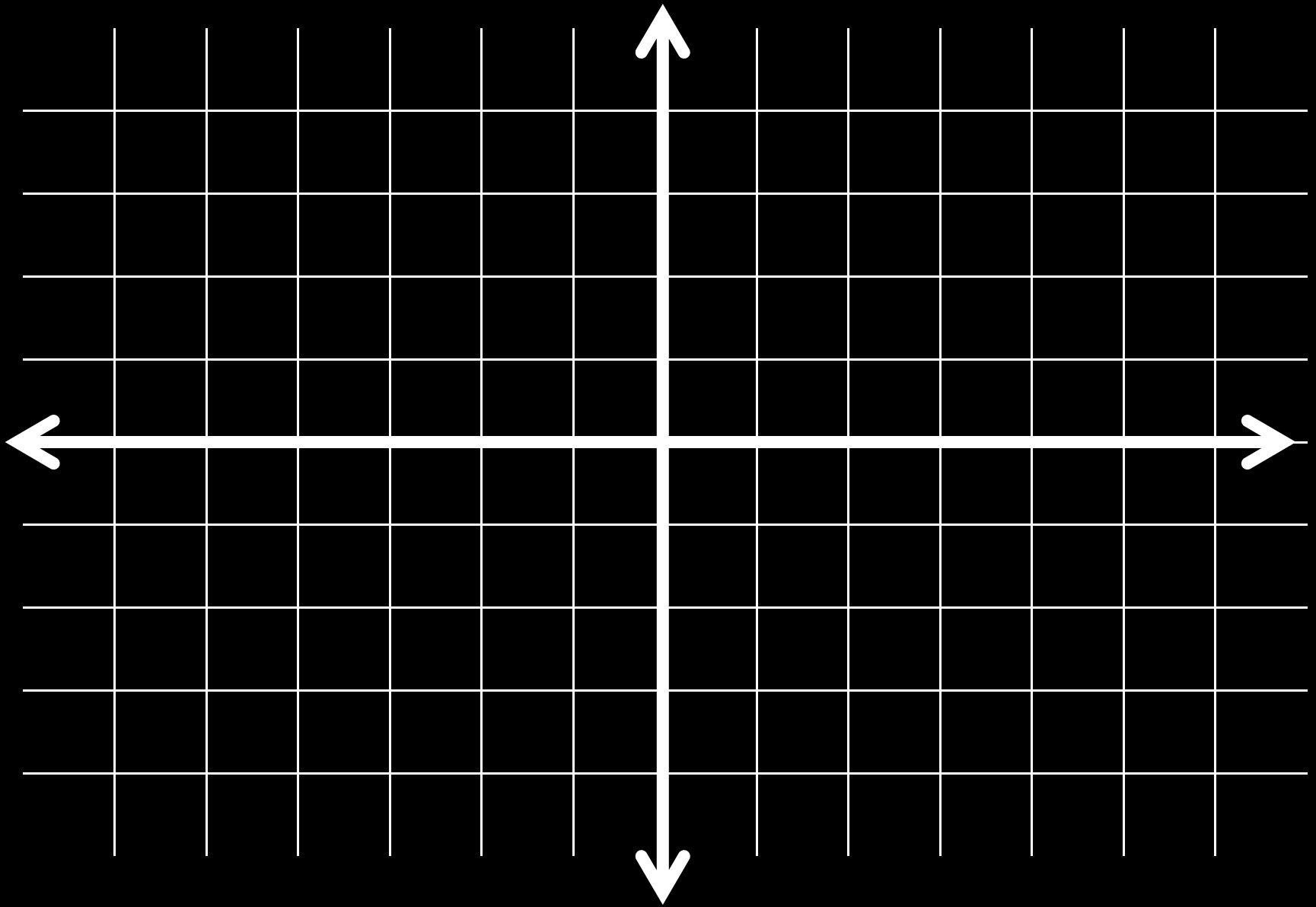


# Defining 1-1 onto $f: \mathbb{N} \rightarrow \mathbb{N} \times \mathbb{N}$

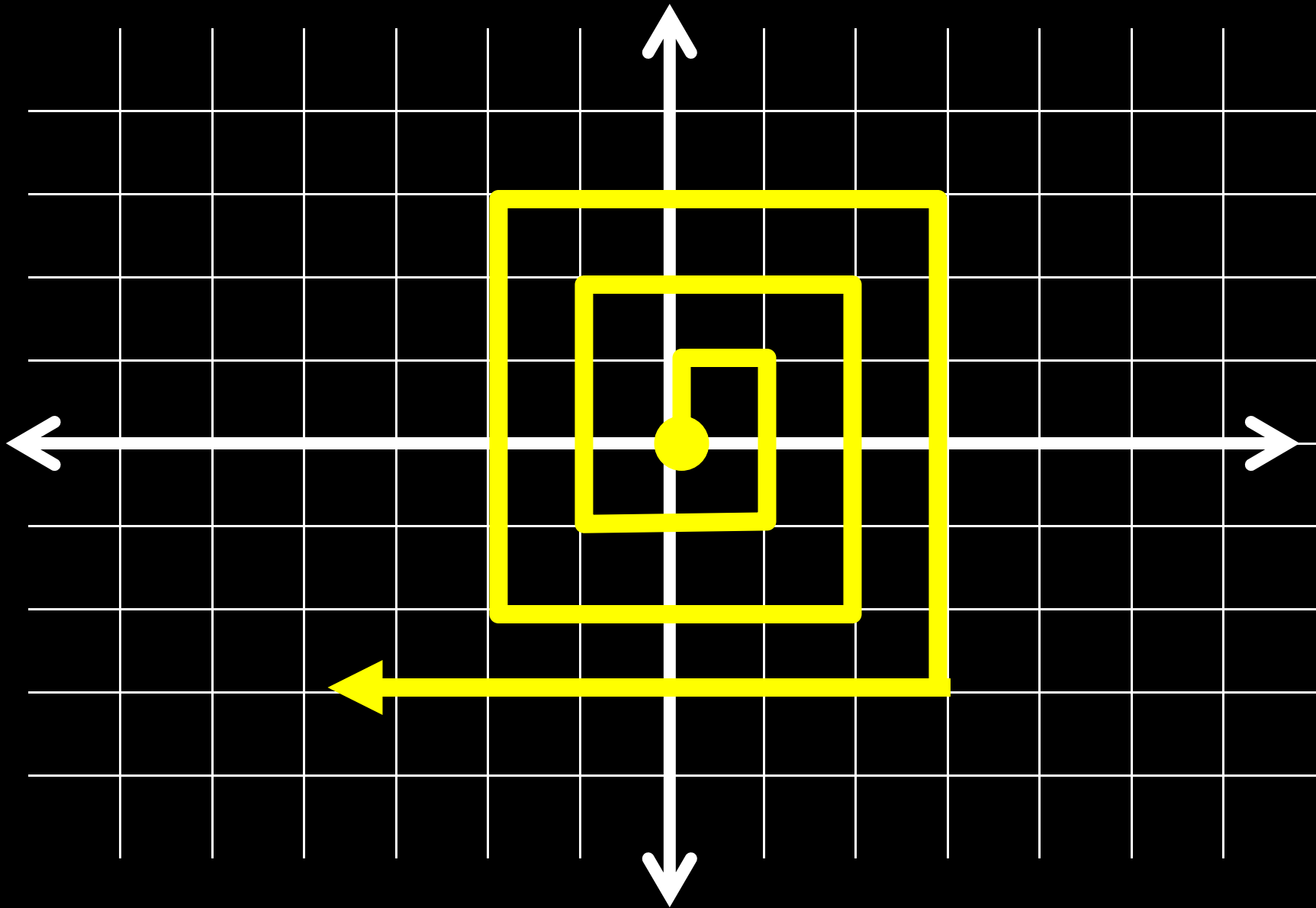
```
int sum;
for (sum = 0; true; sum++) {
    //generate all pairs with this sum
    for (x = 0; x <= sum; x++) {
        y = sum - x;
        System.out.println(x + " " + y);
    }
}
```

Onto the Rationals!





**The point at  $x,y$  represents  $x/y$**



The point at  $x,y$  represents  $x/y$

## Hold it!

You've included both 1,1 and 2,2 –  
They correspond to the same rational.

Also, 0/0, 1/0, 2/0, ... are not rational!

# Hold it!

0	0/0	7	-1/0	14	2/0
1	0/1	8	-1/1	15	2/-1
2	1/1	9	-1/2	16	2/-2
3	1/0	10	0/2	17	1/-2
4	1/-1	11	1/2	18	0/-2
5	0/-1	12	2/2	19	-1/-2
6	-1/-1	13	2/1	20	-2/-2

# Hold it!

0	<del>0/0</del>	7	<del>-1/0</del>	14	<del>2/0</del>
1	0/1	8	<del>-1/1</del>	15	2/-1
2	1/1	9	-1/2	16	<del>2/-2</del>
3	<del>1/0</del>	10	<del>0/2</del>	17	<del>1/-2</del>
4	1/-1	11	1/2	18	<del>0/-2</del>
5	<del>0/-1</del>	12	<del>2/2</del>	19	<del>-1/-2</del>
6	<del>-1/-1</del>	13	2/1	20	<del>-2/-2</del>

# Hold it!

0		7		14	
1	0/1	8		15	2/-1
2	1/1	9	-1/2	16	
3		10		17	
4	1/-1	11	1/2	18	
5		12		19	
6		13	2/1	20	



# Hold it!

0 0/1

1 1/1

2 1/-1

3 -1/2

4 1/2

5 2/1

6 2/-1

## Hold it!

It's okay. We can just skip those. So instead of assigning 0 to  $0/0$  we will assign it to  $0/1$ , and so on.

This way, we'll use all the naturals and we'll hit all the rationals without duplication.

# Cantor-Bernstein-Schroeder

If there exists an injection from  $A$  to  $B$  and an injection from  $B$  to  $A$ , then there exists a bijection between  $B$  and  $A$ .

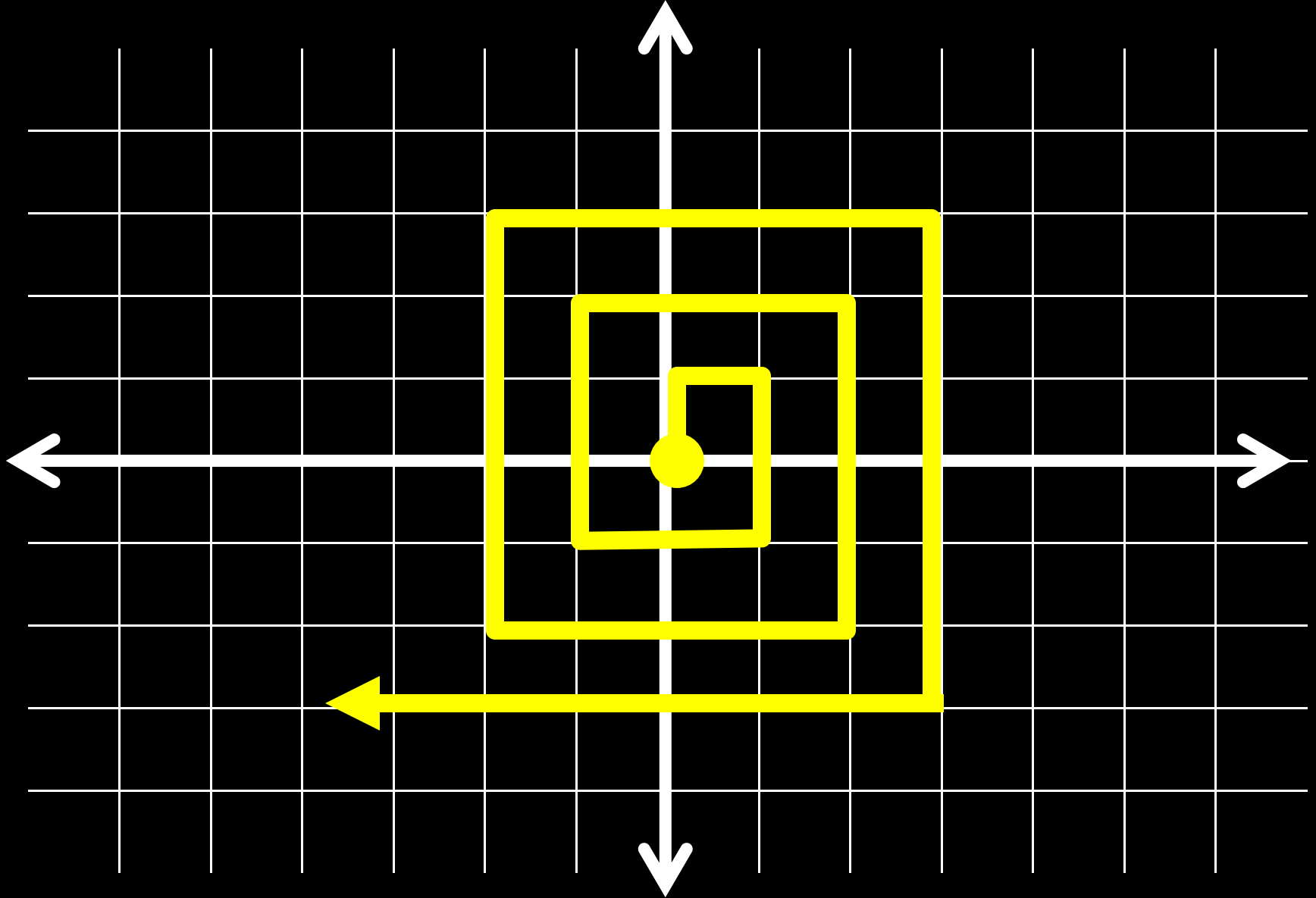
Easy to prove for finite sets, trickier for infinite sets.

# Cantor-Bernstein-Schroeder

Injection from  $\mathbb{N}$  to  $\mathbb{Q}$

$$f(x) = x$$

Injection from  $\mathbb{Q}$  to  $\mathbb{N}$



The point at  $x,y$  represents  $x/y$

# Injection from Q to N

0		7		14	
1	0/1	8		15	2/-1
2	1/1	9	-1/2	16	
3		10		17	
4	1/-1	11	1/2	18	
5		12		19	
6		13	2/1	20	

# Injection from Q to N

0	7	14
$1 \leftarrow 0/1$	8	$15 \leftarrow 2/-1$
$2 \leftarrow 1/1$	$9 \leftarrow -1/2$	16
3	10	17
$4 \leftarrow 1/-1$	$11 \leftarrow 1/2$	18
5	12	19
6	$13 \leftarrow 2/1$	20

# Cantor-Bernstein-Schroeder

## Injection from $\mathbb{Q}$ to $\mathbb{N}$

Just eliminate the invalid matchings.  
We match all the valid rationals and  
never duplicate a natural.

While this misses some naturals, it's  
still an injection.



# Countable Sets

We call a set countable if it can be placed into 1-1 onto correspondence with the natural numbers  $\mathbb{N}$ .

Hence

$\mathbb{N}$ ,  $\mathbb{E}$ ,  $\mathbb{Q}$ , and  $\mathbb{Z}$  are all countable

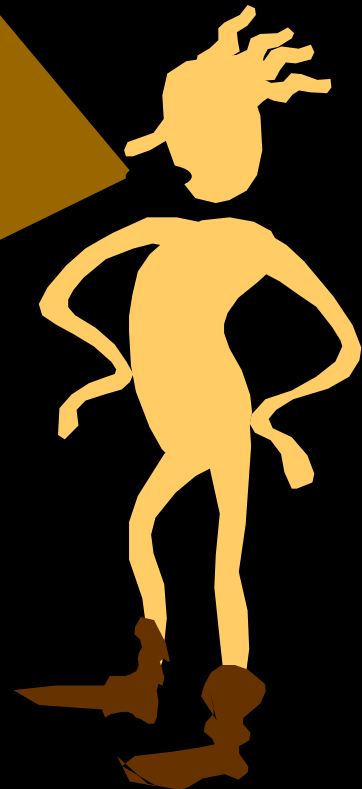
**Do  $\mathbb{N}$  and  $\mathbb{R}$  have the same cardinality?**

**$\mathbb{N} = \{ 0, 1, 2, 3, 4, 5, 6, 7, \dots \}$**

**$\mathbb{R} =$  The Real Numbers**

**No way!**

**You will run out of  
natural numbers long  
before you match up  
every real.**





**Now hang on a minute!**

**You can't be sure that  
there isn't some clever  
correspondence that you  
haven't thought of yet.**

I am sure!  
Cantor proved it.

To do this, he invented a  
very important technique  
called  
**“Diagonalization”**



# Theorem: The set of reals between 0 and 1 is not countable.

Proof: (by contradiction)

Suppose  $\mathbb{R}_{[0,1]}$  is countable.

Let  $f$  be a 1-1 onto function from  $\mathbb{N}$  to  $\mathbb{R}_{[0,1]}$ .

Make a list  $L$  as follows:

0: decimal expansion of  $f(0)$

1: decimal expansion of  $f(1)$

...

$k$ : decimal expansion of  $f(k)$

...

# Theorem: The set of reals between 0 and 1 is not countable.

Proof: (by contradiction)

Suppose  $\mathbb{R}_{[0,1]}$  is countable.

Let  $f$  be a 1-1 onto function from  $\mathbb{N}$  to  $\mathbb{R}_{[0,1]}$ .

Make a list  $L$  as follows:

0: 0.33333333333333333333...

1: 0.314159265657839593...

...

k: 0.235094385543905834...

...

# Position after decimal point

L	0	1	2	3	4	...
0						
1						
2						
3						
...						



# Position after decimal point

L	0	1	2	3	4	...
0	3	3	3	3	3	3
1	3	1	4	1	5	9
2	1	2	4	8	1	2
3	4	1	2	2	6	8
...						

# digits along the diagonal

L	0	1	2	3	4	...
0	$d_0$					
1		$d_1$				
2			$d_2$			
3				$d_3$		
...					...	

L	0	1	2	3	4
0	$d_0$				
1		$d_1$			
2			$d_2$		
3				$d_3$	
...					...

Define the following real number

$$\text{Confuse}_L = . C_0 C_1 C_2 C_3 C_4 C_5 \dots$$

L	0	1	2	3	4
0	$d_0$				
1		$d_1$			
2			$d_2$		
3				$d_3$	
...					...

Define the following real number

$$\text{Confuse}_L = . C_0 C_1 C_2 C_3 C_4 C_5 \dots$$

$$C_k = \begin{cases} 5, & \text{if } d_k = 6 \\ 6, & \text{otherwise} \end{cases}$$

L	0	1	2	3	4
0	$C_0 \neq d_0$	$C_1$	$C_2$	$C_3$	$C_4$
1		$d_1$			
2			$d_2$		
3				$d_3$	
...					...

$$C_k = \begin{cases} 5, & \text{if } d_k = 6 \\ 6, & \text{otherwise} \end{cases}$$

...

L	0	1	2	3	4
0	$d_0$				
1	$C_0$	$C_1 \neq d_1$	$C_2$	$C_3$	$C_4$
2			$d_2$		
3				$d_3$	
...					...

$$C_k = \begin{cases} 5, & \text{if } d_k = 6 \\ 6, & \text{otherwise} \end{cases}$$

...

L	0	1	2	3	4
0	$d_0$				
1		$d_1$			
2	$C_0$	$C_1$	$C_2 \neq d_2$	$C_3$	$C_4$
3				$d_3$	
...					...

$$C_k = \begin{cases} 5, & \text{if } d_k = 6 \\ 6, & \text{otherwise} \end{cases}$$

...

# Diagonalized!

By design, **Confuse<sub>L</sub>** can't be on the list **L**!

**Confuse<sub>L</sub>** differs from the  $k^{\text{th}}$  element on the list **L** in the  $k^{\text{th}}$  position.

This contradicts the assumption that the list **L** is complete; i.e., that the map  $f: \mathbb{N}$  to  $\mathbb{R}_{[0,1]}$  is onto.



The set of reals is  
uncountable!  
(Even the reals between 0  
and 1.)

An aside: you **can** set up a  
correspondence between  $\mathbb{R}$  and  $\mathbb{R}_{[0,1]}$ .



**Hold it!**  
Why can't the same argument be used to show that the set of rationals  $\mathbb{Q}$  is uncountable?



The argument is the same  
for Q until the punchline.

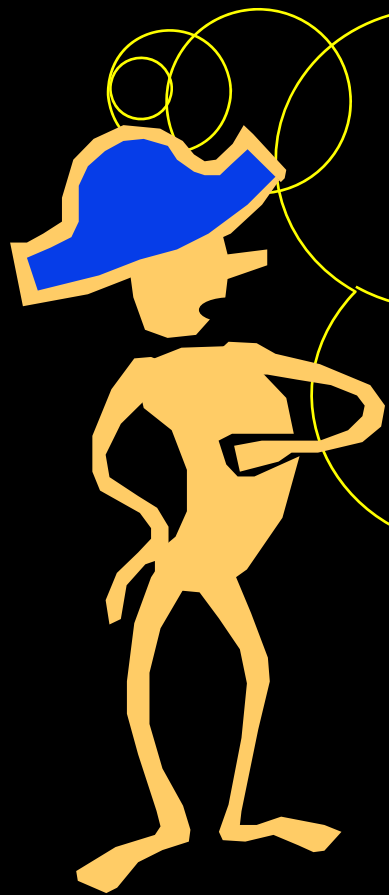
However, since  $\text{CONFUSE}_L$   
is not necessarily rational,  
there is no contradiction  
from the fact that it is  
missing from the list L.



**Back to the questions  
we were asking earlier**

Are all reals describable?  
Are all reals computable?

We saw that  
computable  $\Rightarrow$   
describable,  
but do we also have  
describable  $\Rightarrow$   
computable?



# Standard Notation

$\Sigma =$  Any **finite** alphabet

Example:  $\{a,b,c,d,e,\dots,z\}$

$\Sigma^* =$  All **finite** strings of symbols from  $\Sigma$   
including the empty string  $\varepsilon$

# Theorem: Every infinite subset $S$ of $\Sigma^*$ is countable

## Proof:

Sort  $S$  by first by length and then alphabetically.

Map the first word to 0, the second to 1, and so on....

# Stringing Symbols Together

$\Sigma$  = The symbols on a standard keyboard

**For example:**

The set of all possible Java programs is a subset of  $\Sigma^*$

The set of all possible finite pieces of English text is a subset of  $\Sigma^*$



**Thus:**

**The set of all possible Java programs is countable.**

**The set of all possible finite length pieces of English text is countable.**



There are countably  
many Java program and  
uncountably many reals.

Hence,  
Most reals are not  
computable!





I see!  
There are countably many  
descriptions and  
uncountably many reals.

Hence:  
**Most real numbers are  
not describable!**

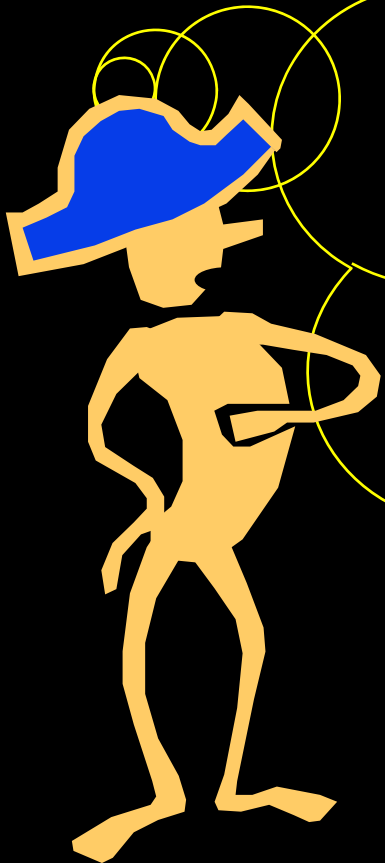
Are all reals describable?

**NO**

Are all reals computable?

**NO**

We saw that  
computable  $\Rightarrow$   
describable,  
but do we also have  
describable  $\Rightarrow$   
computable?





Is there a real number  
that can be described,  
but not computed?

**Wait till the  
next lecture!**

We know there are at least  
2 infinities.

(the number of naturals,  
the number of reals.)

Are there more?



# Definition: Power Set

The power set of  $S$  is the set of all subsets of  $S$ .

The power set is denoted as  $P(S)$ .

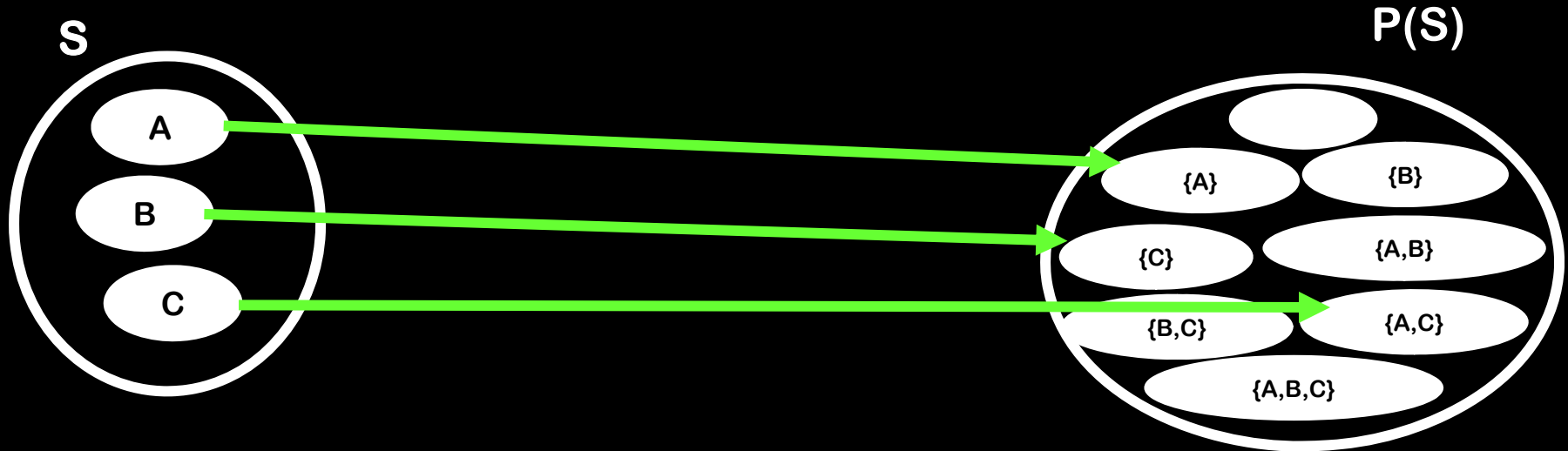
## Proposition:

If  $S$  is finite, the power set of  $S$  has cardinality  $2^{|S|}$

**Theorem:**  $S$  can't be put into bijection with  $P(S)$



**Theorem:**  $S$  can't be put into bijection with  $P(S)$



Suppose  $f: S \rightarrow P(S)$  is a bijection.

Let  $CONFUSE_f$  contain all and only those elements that are not in the sets they map to

Since  $f$  is onto, exists  $y \in S$  such that  $f(y) = CONFUSE_f$ .

Is  $y$  in  $CONFUSE_f$ ?

YES: Definition of  $CONFUSE_f$  implies no

NO: Definition of  $CONFUSE_f$  implies yes

This proves that there are at least a countable number of infinities.

The first infinity is called:

$\aleph_0$



$|N|, |P(N)|, |P(P(N))|, \dots$

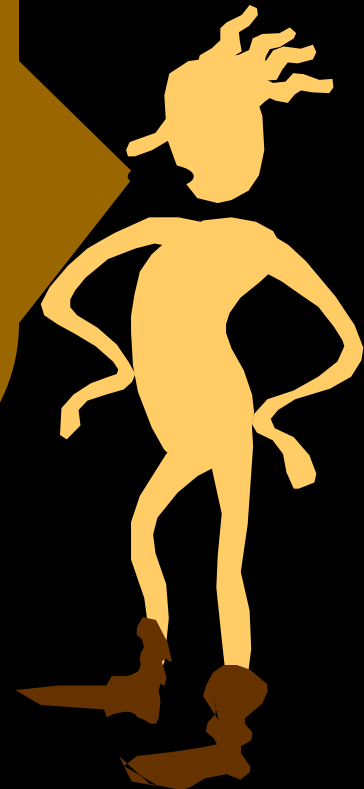
Are there any  
more infinities?



$N, P(N), P(P(N)), \dots$

Let  $S$  be the union of all  
of them!

Then  $S$  cannot be  
bijected to any of them!



In fact, the same argument can be used to show that no single infinity is big enough to count the number of infinities!



Cantor wanted to  
show that there was  
no infinity between  $|N|$   
and  $|P(N)|$



Cantor called his  
conjecture the  
“Continuum Hypothesis.”

However, he was unable to  
prove it. This helped fuel  
his depression.



**The Continuum  
Hypothesis can't be  
proved or disproved from  
the standard axioms of  
set theory!**

**This has been proved!**





# Little Susie and Little Johnny

What Little Susie should've said to  
Little Johnny:

Little Johnny: I hate you times **infinity**

Little Susie: I hate you times **2 to the  
infinity!**

Little Johnny: I hate you times **2 to the  
2 to the infinity!**

...



Here's What  
You Need to  
Know...

**Cantor's Definition:**

Two sets have the same cardinality if there exists a bijection between them.

$|E| = |N| = |Z| = |Q|$  (and proofs),  
Cantor-Bernstein-Schroeder

Proof that there is no  
bijection between  $N$  and  $R$

Countable  
versus Uncountable

Power sets and their properties