

The reals.

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Construct “diagonal” number:

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Construct “diagonal” number: .7

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Construct “diagonal” number: .77

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Subset $[0, 1]$ is not countable!!

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What about all reals?

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Any subset of a countable set is countable.

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If reals are countable then so is $[0, 1]$.

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1. Assume that a set S can be enumerated.

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Another diagonalization.

The set of all subsets of N .

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Example subsets of N : $\{0\}$,

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Theorem: The set of all subsets of N is not countable.
(The set of all subsets of S , is the **powerset** of N .)

Poll: diagonalization Proof.

Mark parts of proof.

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- (A) Integers are larger than naturals cuz obviously.
- (B) Integers are countable cuz, interleaving bijection.
- (C) Reals are uncountable cuz obviously!
- (D) Reals can't be in a list: diagonal number not on list.
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- (B), (C)?, (D), (E)

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There is no infinite set whose cardinality is between the cardinality of an infinite set and its power set.

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The powerset of a set is the set of all subsets.

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Who shaves the barber?

Self reference.

Can a program refer to a program?

Can a program refer to itself?

Uh oh....

The Barber!

The barber shaves every person who does not shave themselves.

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- (A) Barber not Mark. Barber shaves Mark.
- (B) Mark shaves the Barber.
- (C) Barber doesn't shave himself.
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Its all true.

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Its all true. It's a problem.

Generalized Continuum hypothesis.

There is no infinite set whose cardinality is between the cardinality of an infinite set and its power set.

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The powerset of a set is the set of all subsets.

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The powerset of a set is the set of all subsets.

Recall: powerset of the naturals is not countable.

Resolution of hypothesis?

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Gödel. 1940.

Can't use math!

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If math doesn't contain a contradiction.

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Changing Axioms?

Goedel:

Any set of axioms is either

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Any set of axioms is either
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See Logicomix by Doxiadis, Papadimitriou (was professor here), Papadatos, Di Donna.

Is it actually useful?

Write me a program checker!

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Check that the compiler works!

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How about.. Check that the compiler terminates on a certain input.

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Run P on I and check!

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How long do you wait?

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Run P on I and check!

How long do you wait?

Something about infinity here, maybe?

Halt does not exist.

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HALT(P, I)

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Theorem: There is no program HALT.

Halt does not exist.

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Yes! No!...

What is he talking about?

Yes! No!...

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- (A) He is confused.
- (B) Diagonalization.
- (C) Welch-Berlekamp
- (D) Professor is just strange.

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- (B)

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- (A) He is confused.
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- (B) and (D)

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 - (C) Welch-Berlekamp
 - (D) Professor is just strange.
- (B) and (D) maybe? and maybe (A).

Professor does me some love Welch-Berlekamp though!

Halt and Turing.

Proof:

Halt and Turing.

Proof: Assume there is a program $HALT(\cdot, \cdot)$.

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Turing(P)

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1. If $HALT(P,P)$ = "halts", then go into an infinite loop.

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1. If $HALT(P,P)$ = "halts", then go into an infinite loop.
2. Otherwise, halt immediately.

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Questions?



Another view of proof: diagonalization.

Any program is a fixed length string.

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- (A) Instructions.
- (B) Text.
- (C) Binary String.
- (D) They run on computers.

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All are correct.

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We are so smart!

Wow, that was easy!

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We should be famous!

No computers for Turing!

In Turing's time.

No computers for Turing!

In Turing's time.

No computers.

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No computers.

Adding machines.

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e.g., Babbage (from table of logarithms) 1812.

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Adding machines.

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Concept of program as data wasn't really there.

Turing machine.

Turing machine.

- A Turing machine.
- an (infinite) tape with characters

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- an (infinite) tape with characters
- be in a state, and read a character

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Turing: AI, self modifying code, learning...

Turing and computing.

Just a mathematician?

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The polish machine...the *bomba*.

Computing on top of computing...

Computer, assembly code, programming language, browser, html, javascript..

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Computer, assembly code, programming language, browser, html, javascript..

We can't get enough of building more Turing machines.

Undecidable problems.

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How?

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\implies no program can take any set of integer equations and

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How? What is P ? Text!!!!!!

Find exit points and add statement: **Print** “Hello World.”

Can a set of notched tiles tile the infinite plane?

Proof: simulate a computer. Halts if finite.

Does a set of integer equations have a solution?

Example: “ $x^n + y^n = 1$?”

Problem is undecidable.

Be careful!

Is there an integer solution to $x^n + y^n = 1$?

(Diophantine equation.)

The answer is yes or no. This “problem” is not undecidable.

Undecidability for Diophantine set of equations

⇒ no program can take any set of integer equations and always correctly output whether it has an integer solution.

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Turing: personal.

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- ▶ British Government apologized (2009) and pardoned (2013).

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Program is text, so we can pass it to itself,
or refer to self.

Summary: decidability.

Computer Programs are an interesting thing.

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Computation is a lens for other action in the world.

Kolmogorov Complexity, Google, and CS70

Of strings, s .

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Minimum sized program that prints string s .

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What Kolmogorov complexity of a string of 1,000,000, one's?

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for $i = 1$ to n : print '1'.

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What is the minimum I need to know (remember) to know stuff.

Kolmogorov Complexity, Google, and CS70

What is the minimum I need to know (remember) to know stuff.

Radius of the earth?

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Solution to: $dy/dx = y$,

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Calculus:

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Calculus: what is minimum you need to know?

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Depends on your skills!

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Reason and understand an argument and you can generate a lot.

Calculus

What is the first half of calculus about?

Calculus

What is the first half of calculus about?

The slope of a tangent line to a function at a point.

Calculus

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used foil.

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What is x ? An angle in radians.

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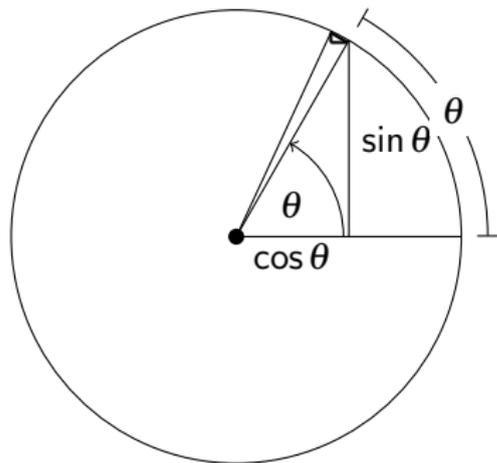
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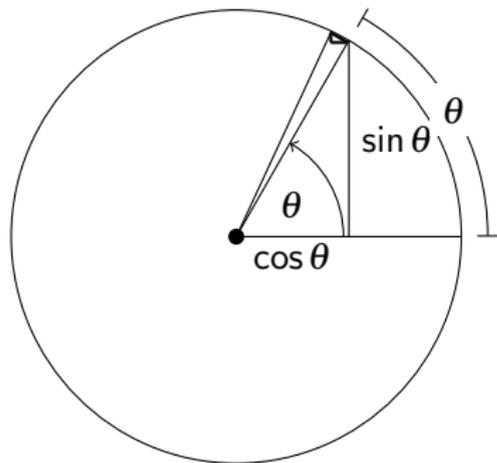
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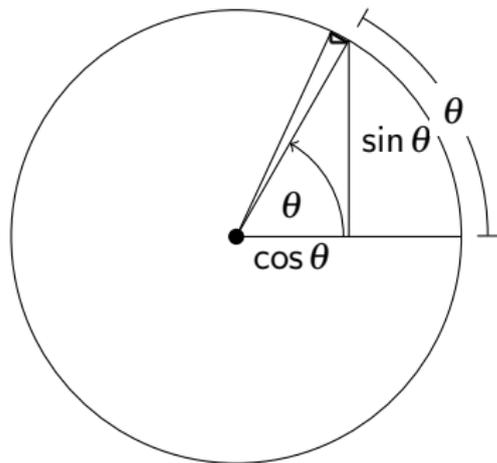
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Similar triangle!!!

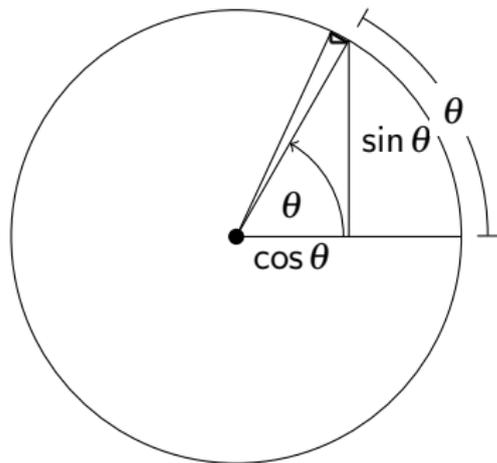
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Rise proportional to cosine!

Fundamental Theorem of Calculus.

Conceptual: Height times Width = Area.

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Useful?

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Speed times Time is Distance.

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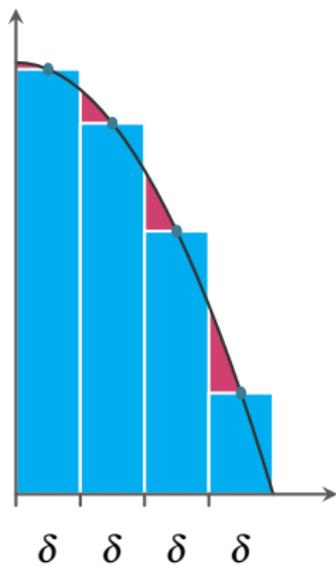
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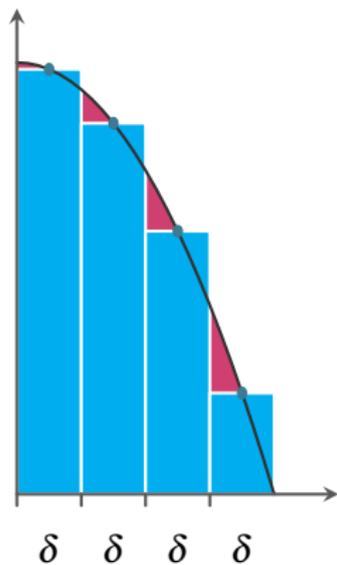
If you change width, change in area is proportional to height.

Derivative (rate of change) of Area (Integral) under curve, is height of curve.

Calculus

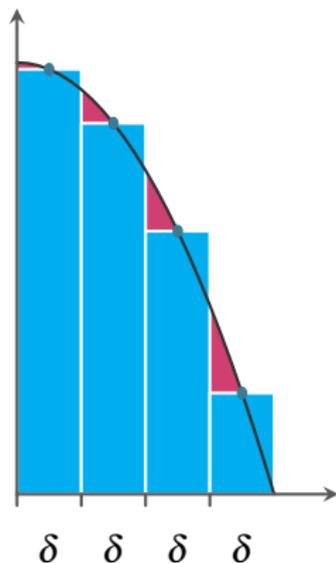


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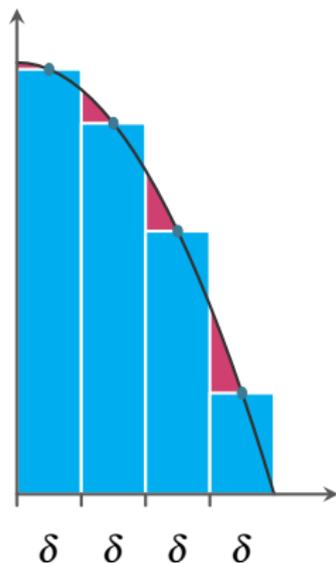
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Calculus



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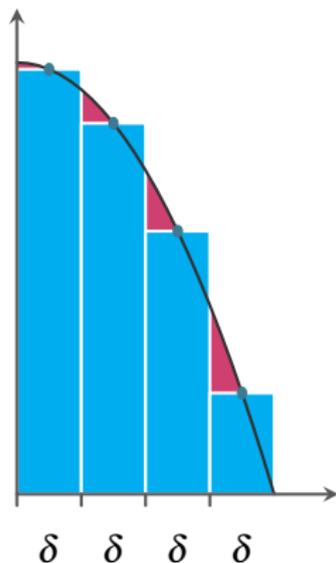
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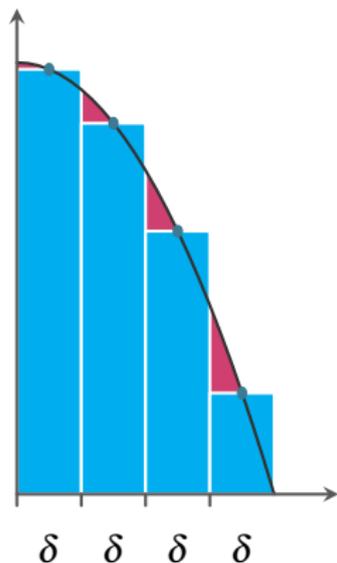
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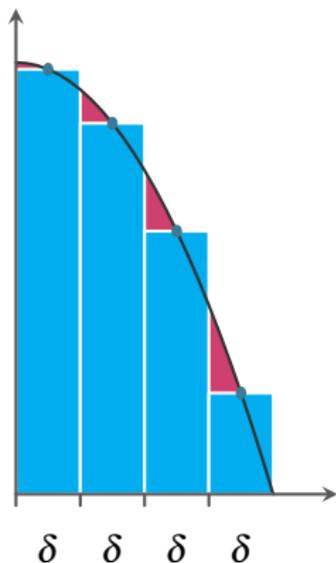
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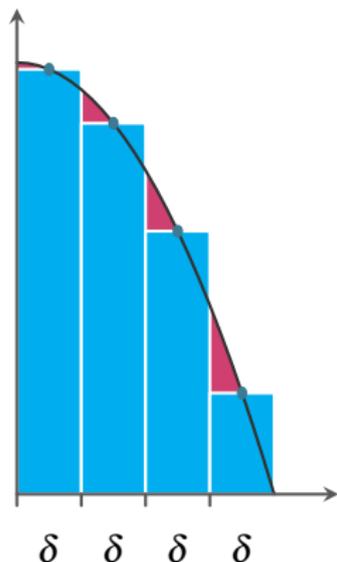
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“Area ($F(\cdot)$) under $f(x)$ grows at x , $F'(x)$, by $f(x)$ ”

Thus $F'(x) = f(x).$

Arguments, reasoning.

What you know: slope, limit.

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Plus: definition.

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Knowing how to program plus some syntax (google) gives the ability to program.

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...plus reasoning.

CS 70 : ideas.

Induction

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Induction \equiv every integer has a next one.

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Induction \equiv every integer has a next one. Graph theory.

Number of edges is sum of degrees.

$\Delta + 1$ coloring. Neighbors only take up Δ .

Connectivity plus connected components.

Eulerian paths: if you enter you can leave.

Euler's formula: tree has $v - 1$ edges and 1 face plus
each extra edge makes additional face.

$$v - 1 + (f - 1) = e$$

CS 70 : ideas.

Number theory.

A divisor of x and y divides $x - y$.

The remainder is always smaller than the divisor.

\implies Euclid's GCD algorithm.

Multiplicative Inverse.

Fermat's theorem from function with inverse is a bijection.

Gives RSA.

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Error Correction.

(Any) Two points determine a line.

(well, and d points determine a degree $d + 1$ -polynomials.

Cuz, factoring.

Find line by linear equations.

If a couple are wrong, then multiply them by zero, i.e., Error polynomial.

CS70 and your future?

What's going on?

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....and you will pursue probability in this course.