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Recall: powerset of the naturals is not countable.

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Uh oh....

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How long do you wait?

Something about infinity here, maybe?

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Yes! No!...

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(A) He is confused.

Yes! No!...

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(A) He is confused.

(B) Diagonalization.

Yes! No!...

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- (C) Welch-Berlekamp

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Professor does love Welch-Berlekamp though!

# Halt and Turing.

**Proof:**

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$P_2$	L	L	H	$\dots$
$P_3$	L	H	H	$\dots$
$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\ddots$

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Halt - diagonal.

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Halt - diagonal.

Turing - is **not** Halt.

## Another view of proof: diagonalization.

Any program is a fixed length string.

Fixed length strings are enumerable.

Program halts or not on any input, which is a string.

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- (A) Instructions.
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All are correct.

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Assumed  $\text{HALT}(P, I)$  existed.

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Questions?

We are so smart!

Wow, that was easy!

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We should be famous!

# No computers for Turing!

In Turing's time.

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No computers.

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

# Turing and computing.

Just a mathematician?

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“Wrote” a chess program.

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

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But HALT does not exist  $\implies$  “HELLO, WORLD?” does not exist.

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

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Remove all print statements.

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Computing as a lense: Science, Quantum Computing, DNA, ...

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

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## Summary: decidability.

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Computation is a lens for other action in the world.

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Of strings,  $s$ .

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

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Depends on your skills! Conceptualization.

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

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$$(f(g(x)))' = f'(g(x))g'(x).$$

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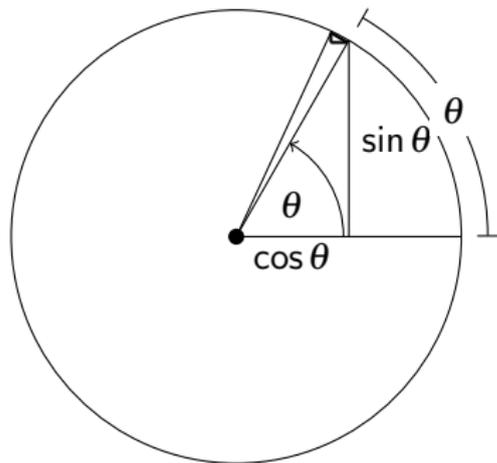
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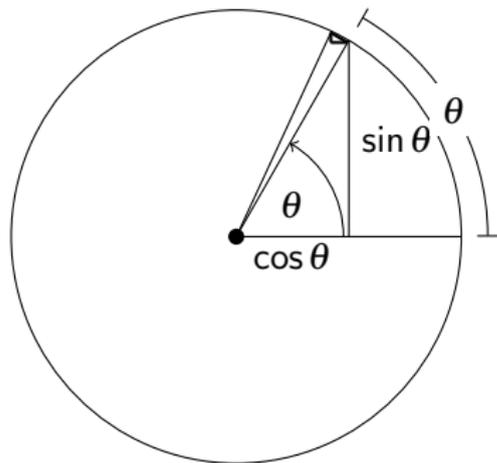
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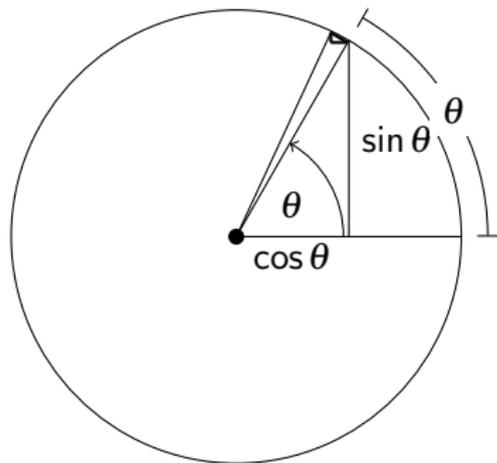
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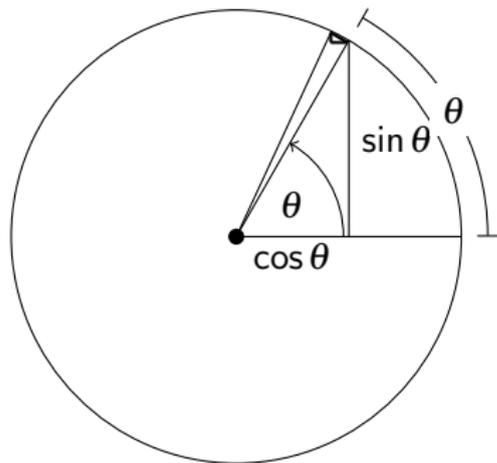
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Rise proportional to cosine!

# Fundamental Theorem of Calculus.

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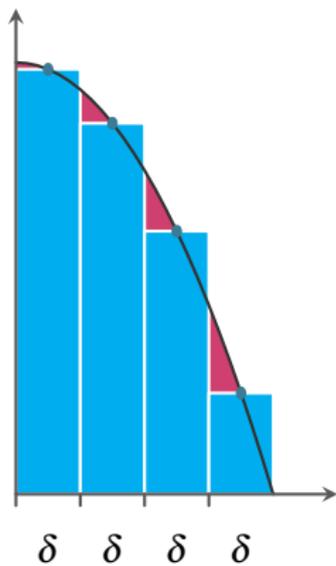
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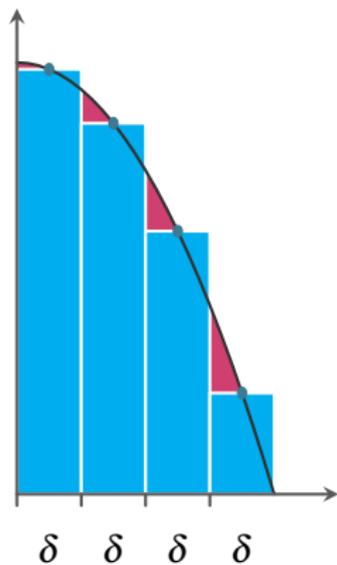
If you change width, change in area is proportional to height.

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

# Calculus

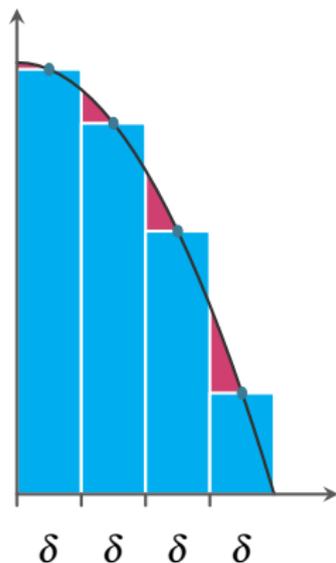


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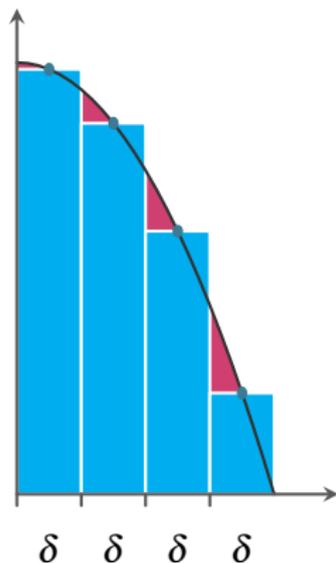
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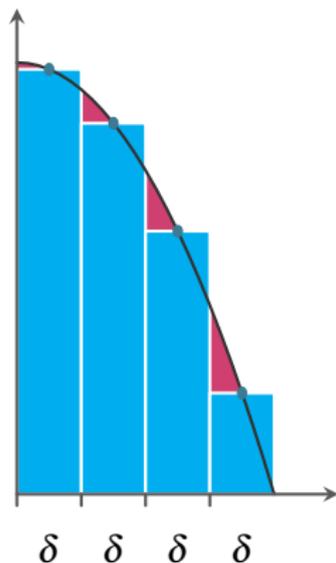
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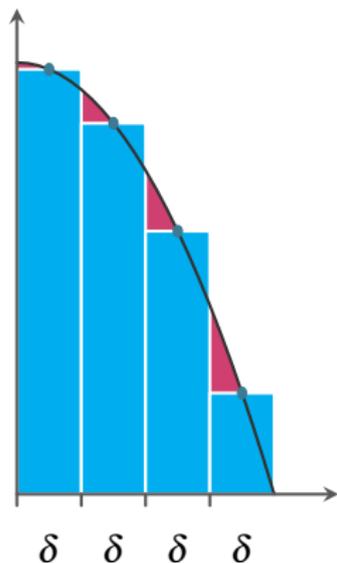
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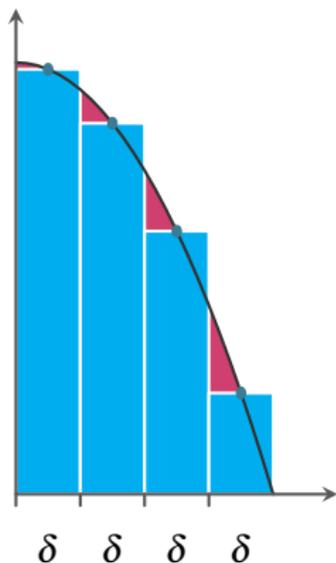
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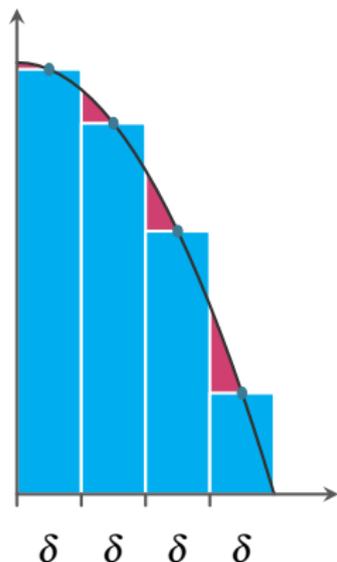
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Thus  $F'(x) = f(x)$ .

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

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The remainder is always smaller than the divisor.

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Multiplicative Inverse.

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Multiplication is commutative.

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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 an equation is wrong, then multiply them by zero, i.e., Error polynomial.

# Probability

Next up?

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What is the chance that a ball taken from the bag is blue?

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