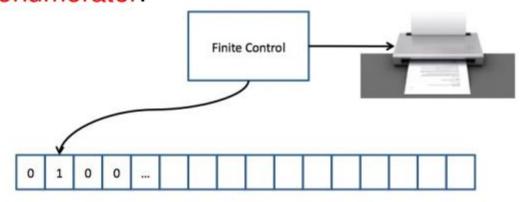
- Remember we noted that some books used the term recursively enumerable for Turing-recognizable.
- This term arises from a variant of a TM called an enumerator.



- TM generates strings one by one.
- Everytime the TM wants to add a string to the list, it sends it to the printer.

Loosely defined, an enumerator is a Turing machine with an attached printer.

- The enumerator E starts with a blank input tape.
- If it does not halt, it may print an infinite list of strings.
- The strings can be enumerated in any order; repetitions are possible.
- The language of the enumerator is the collection of strings it eventually prints out.

 We can assume that the enumerator E writes one string at a time over a tape (it can use a tape symbol # to separate strings).

THEOREM

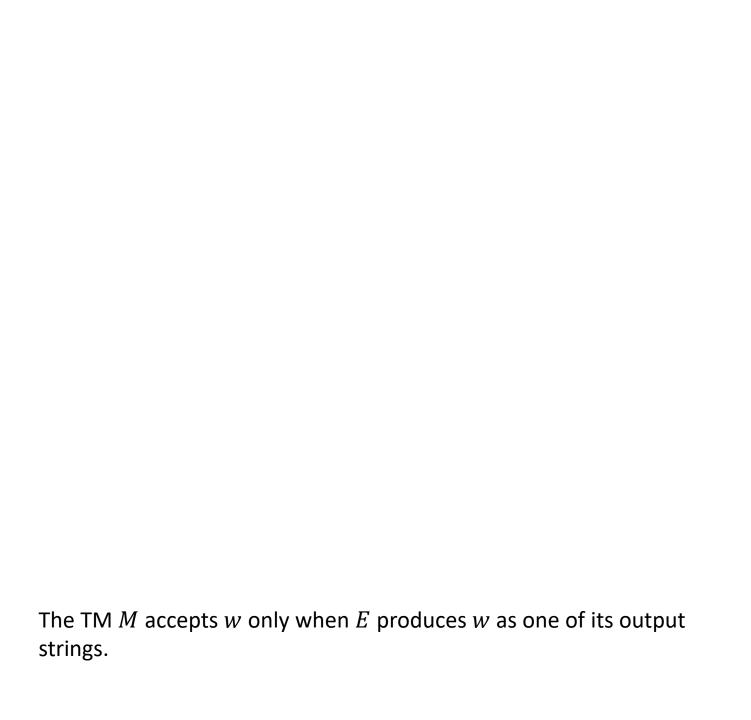
A language is Turing recognizable if and only if some enumerator enumerates it.

PROOF.

The If-part: If an enumerator *E* enumerates the language *A* then a TM *M* recognizes *A*.

- M = "On input w
 - Run E. Everytime E outputs a string, compare it with w.
 - If w ever appears in the output of E, accept."

Clearly *M* accepts only those strings that appear on *E*'s list.



THEOREM

A language is Turing recognizable if and only if some enumerator enumerates it.

Proof.

The Only-If-part: If a TM *M* recognizes a language *A*, we can construct the following enumerator for *A*.

• For each possible string $s \in \Sigma^*$ we can verify whether M accepts s, if so output s on to the tape .

Following attempt, does not work.

- Assume that there is an enumerator which enumerates Σ^* in a standard order.
- For each possible string $s \in \Sigma^*$ we can verify whether M accepts s, if so output s on to the tape .
- The problem with this is, for some s the TM M
 can enter in to an infinite loop and never returns.
 - There may be other strings which are accepted by M but will never gets a chance to be verified (and thus never is outputted).

 A feasible way of doing this (without falling in to an infinite loop) is given in the next slide.

Basic idea:

- For example if there are two strings w1 and w2 and one of them makes the TM to loop infinitely. Do the following.
 - 1. k = 1
 - 2. Run TM for k steps on w1 and if accept occurs then output "accept" and stop.
 - 3. Run TM for k steps on w2 and if accept occurs then output "accept" and stop.
 - 4. k++; goto step 2.

THEOREM

A language is Turing recognizable if and only if some enumerator enumerates it.

PROOF.

The Only-If-part: If a TM M recognizes a language A, we can construct the following enumerator for A. Assume s_1, s_2, s_3, \ldots is a list of possible strings in Σ^* .

- E = "Ignore the input
 - Repeat the following for i = 1, 2, 3, ...
 - Run *M* for *i* steps on each input $s_1, s_2, s_3, \dots s_i$.
 - If any computations accept, print out corresponding s_i."

If M accepts a particular string, it will appear on the list generated by E (in fact infinitely many times)

THE DEFINITION OF ALGORITHM - HISTORY

• in 1900, Hilbert posed the following problem:

"Given a polynomial of several variables with integer coefficients, does it have an integer root – an assignment of integers to variables, that make the polynomial evaluate to 0"

- For example, $6x^3yz^2 + 3xy^2 x^3 10$ has a root at x = 5, y = 3, z = 0.
- Hilbert explicitly asked that an algorithm/procedure to be "devised". He assumed it existed; somebody needed to find it!
- 70 years later it was shown that no algorithm exists.
- The intuitive notion of an algorithm may be adequate for giving algorithms for certain tasks, but was useless for showing no algorithm exists for a particular task.

This is known as Hilbert's Tenth Problem.

THE DEFINITION OF ALGORITHM - HISTORY

- In early 20th century, there was no formal definition of an algorithm.
- In 1936, Alonzo Church and Alan Turing came up with formalisms to define algorithms. These were shown to be equivalent, leading to the

CHURCH-TURING THESIS

Intutitive notion of algorithms

Turing Machine Algorithms

THE DEFINITION OF AN ALGORITHM

- Let $D = \{p \mid p \text{ is a polynomial with integral roots}\}$
- Hilbert's 10th problem in TM terminology is "Is D decidable?" (No!)
- However D is Turing-recognizable!
- Consider a simpler version $D_1 = \{p \mid p \text{ is a polynomial over } x \text{ with integral roots}\}$
- M_1 = "The input is polynomial p over x.
 - Evaluate p with x successively set to 0, 1, -1, 2, -2, 3, -3,
 - If at any point, p evaluates to 0, accept."
- D₁ is actually decidable since only a finite number of x values need to be tested (math!)
- D is also recognizable: just try systematically all integer combinations for all variables.

- For D_1 (polynomial of single variable) there is a bound and we can abandon the search beyond that and declare "No".
- The roots of such a polynomial must lie between the values:

$$\pm k \frac{C_{max}}{C_1}$$

- k is the number of terms in the polynomial, cmax is the coefficient with the largest absolute value, and c1 is the coefficient of the highest order term.
- For D such a bound cannot exist (proof is given by Matijasevich (1971)).
 - So, if answer is "No" we enter in to an infinite loop.

In 1971, Yuri Matijasevich gave a resounding negative answer to Hilbert's tenth problem.

- This is called undecidability.
- Hilbert's tenth problem is undecidable.

Decidability

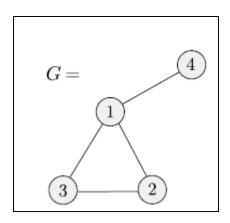
Theory behind existence of undecidable problems – Halting Problem --

Ref: https://www.andrew.cmu.edu/user/ko/pdfs/lecture-15.pdf

DESCRIBING TURING MACHINES AND THEIR INPUTS

- For the rest of the course we will have a rather standard way of describing TMs and their inputs.
- The input to TMs have to be strings.
- Every object O that enters a computation will be represented with an string (O), encoding the object.
- For example if G is a 4 node undirected graph with 4 edges $\langle O \rangle = (1, 2, 3, 4) ((1, 2), (2, 3), (3, 1), (1, 4))$
- Then we can define problems over graphs, e.g., as:

$$A = \{\langle G \rangle \mid G \text{ is a connected undirected graph}\}$$



DESCRIBING TURING MACHINES AND THEIR INPUTS

- A TM for this problem can be given as:
- M = "On input $\langle G \rangle$, the encoding of a graph G:
 - Select the first node of G and mark it.
 - Repeat 3) until no new nodes are marked
 - For each node in G, mark it, if there is edge attaching it to an already marked node.
 - Scan all the nodes in G. If all are marked, the accept, else reject"

- Important thing to understand is that a machine (computing machine) can be represented as a string in some language.
 - It will be a string over some alphabet.
 - This is, in some sense, equivalent to say that program is also data.

Representation Vs. Real Thing

- DNA represents a living thing (like a humanbeing).
- Some people believe (!) that this is a complete description of a human being.
- You can know his personality, you can even know what he will do in future?
 - Some Hollywood movies captured this idea.

- A representation in itself is lifeless.
- A program in itself cannot process the data.
- It has to be realized through a processing unit or DNA has to be realized through a laboratory test tube or so.

- But the processing unit, now can be entirely independent of the program.
- It can execute any program.

We can give program, data
 purpose computer which runs the program over the data and gives the output.

- A TM M also can be represented as a string.
- Call this string $\langle M \rangle$.
- < M > is like a program.
- Working of TM M on a string w can be realized by a general purpose computer like machine.
- This machine which can take input $\langle M, w \rangle$ and outputs what the TM M does with w_i is called the Universal Turing Machine.

DECIDABILITY

- We investigate the power of algorithms to solve problems.
- We discuss certain problems that can be solved algorithmically and others that can not be.
- Why discuss unsolvability?
- Knowing a problem is unsolvable is useful because
 - you realize it must be simplified or altered before you find an algorithmic solution.
 - you gain a better perspective on computation and its limitations.