



The Big Picture

Chapter 3



Examining Computational Problems

- We want to examine a given computational problem and see how difficult it is.
- Then we need to compare problems
- Problems appear different

- We want to cast them into the same kind of problem
 - decision problems
 - in particular, language recognition problem

Decision Problems

A **decision problem** is simply a problem for which the answer is yes or no (True or False). A **decision procedure** answers a decision problem.

Examples:

- Given an integer n , does n have a pair of consecutive integers as factors?

- The language recognition problem: Given a language L and a string w , is w in L ?



Our focus



The Power of Encoding

- For problem already stated as decision problems.
 - encode the inputs as strings and then define a language that contains exactly the set of inputs for which the desired answer is yes.
- For other problems, must first reformulate the problem as a decision problem, then encode it as a language recognition task



Everything is a String

Pattern matching on the web:

- Problem: Given a search string w and a web document d , do they match? In other words, should a search engine, on input w , consider returning d ?
- The language to be decided: $\{ \langle w, d \rangle : d \text{ is a candidate match for the query } w \}$



Everything is a String

Does a program always halt?

- Problem: Given a program p , written in some some standard programming language, is p guaranteed to halt on all inputs?
- The language to be decided:

$$HP_{ALL} = \{p : p \text{ halts on all inputs}\}$$



Everything is a String

What If we're not working with strings?

Anything can be encoded as a string.

$\langle X \rangle$ is the string encoding of X .

$\langle X, Y \rangle$ is the string encoding of the pair X, Y .

Everything is a String

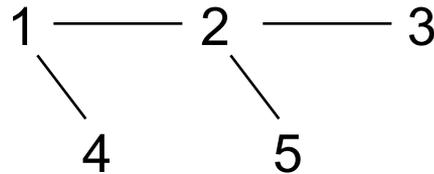
Primality Testing

- Problem: Given a nonnegative integer n , is it prime?
- An instance of the problem: Is 9 prime?
- To encode the problem we need a way to encode each instance: We encode each nonnegative integer as a binary string.
- The language to be decided:

$\text{PRIMES} = \{w : w \text{ is the binary encoding of a prime number}\}.$

Everything is a String

- Problem: Given an undirected graph G , is it connected?
- Instance of the problem:



- Encoding of the problem: Let V be a set of binary numbers, one for each vertex in G . Then we construct $\langle G \rangle$ as follows:
 - Write $|V|$ as a binary number,
 - Write a list of edges,
 - Separate all such binary numbers by “/”.

101/1/10/10/11/1/100/10/101

- The language to be decided: $\text{CONNECTED} = \{w \in \{0, 1, /\}^* : w = n_1/n_2/\dots/n_i, \text{ where each } n_i \text{ is a binary string and } w \text{ encodes a connected graph, as described above}\}$.

Turning Problems Into Decision Problems

Casting multiplication as decision:

- Problem: Given two nonnegative integers, compute their product.
- Reformulation: Transform computing into verification.
- The language to be decided:

$L = \{w \text{ of the form:}$

$\langle integer_1 \rangle_x \langle integer_2 \rangle = \langle integer_3 \rangle$, where:

$integer_n$ is any well formed integer, and

$integer_3 = integer_1 * integer_2\}$

$$12 \times 9 = 108$$

$$12 = 12$$

$$12 \times 8 = 108$$

Turning Problems Into Decision Problems

Casting sorting as decision:

- Problem: Given a list of integers, sort it.
- Reformulation: Transform the sorting problem into one of examining a pair of lists.
- The language to be decided:

$$L = \{w_1 \# w_2 : \exists n \geq 1 \\ (w_1 \text{ is of the form } \langle int_1, int_2, \dots, int_n \rangle, \\ w_2 \text{ is of the form } \langle int_1, int_2, \dots, int_n \rangle, \text{ and} \\ w_2 \text{ contains the same objects as } w_1 \text{ and} \\ w_2 \text{ is sorted})\}$$

Examples:

1, 5, 3, 9, 6 # 1, 3, 5, 6, 9

1, 5, 3, 9, 6 # 1, 2, 3, 4, 5, 6, 7

Turning Problems Into Decision Problems

Casting database querying as decision:

- Problem: Given a database and a query, execute the query.
- Reformulation: Transform the query execution problem into evaluating a reply for correctness.
- The language to be decided:

$L = \{d \# q \# a:$

d is an encoding of a database,

q is a string representing a query, and

a is the correct result of applying q to d \}

Example:

```
(name, age, phone), (John, 23, 567-1234)
(Mary, 24, 234-9876) # (select name age=23) #
(John)
```



The Traditional Problems and their Language Formulations are Equivalent

By equivalent we mean that either problem can be *reduced to* the other.

If we have a machine to solve one, we can use it to build a machine to do the other using just the starting machine and other functions that can be built using a machine of equal or lesser power.

An Example

Consider the multiplication example:

$L = \{w \text{ of the form:}$

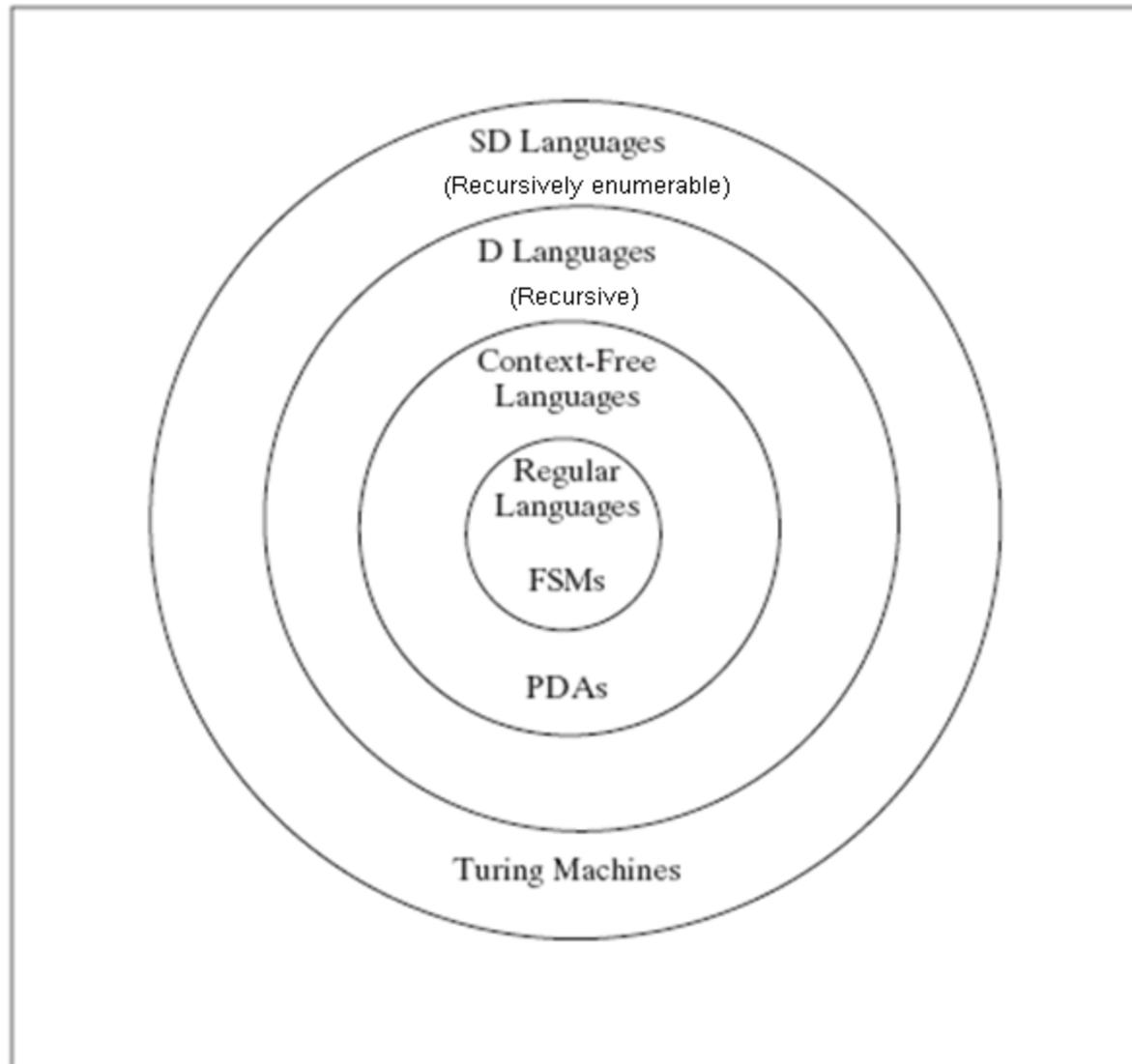
$\langle integer_1 \rangle \times \langle integer_2 \rangle = \langle integer_3 \rangle$, where:

$integer_n$ is any well formed integer, and
 $integer_3 = integer_1 * integer_2$

Given a multiplication machine, we can build the language recognition machine:

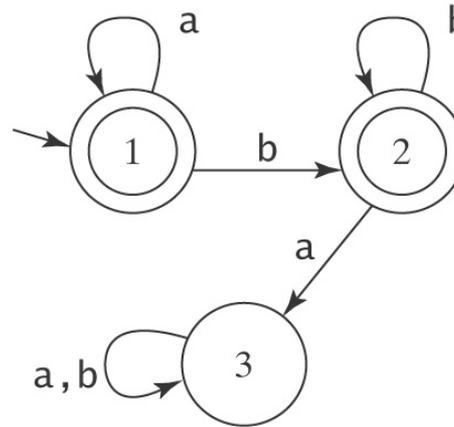
Given the language recognition machine, we can build a multiplication machine:

Languages and Machines



Finite State Machines

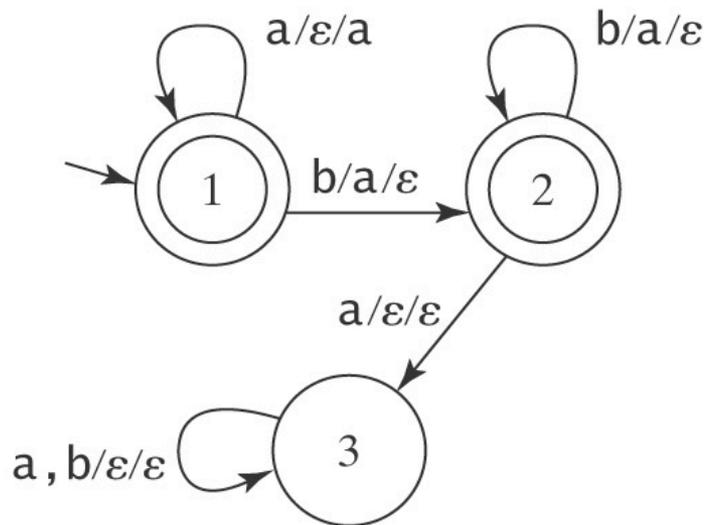
An FSM to accept a^*b^* :



- We call the class of languages acceptable by some FSM **regular**
- There are simple useful languages that are not regular:
 - An FSM to accept $A^nB^n = \{a^n b^n : n \geq 0\}$
 - How can we compare numbers of a's and b's?
 - The only memory in an FSM is in the states and we must choose a fixed number of states in building it. But no bound on number of a's

Pushdown Automata

Build a PDA (roughly, FSM + a single stack)
to accept $A^nB^n = \{a^n b^n : n \geq 0\}$



Example: aaabb

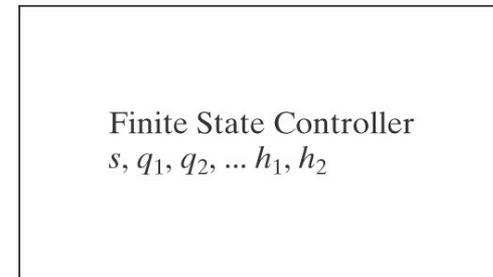
Stack:

Another Example

- Bal, the language of balanced parentheses
 - contains strings like $(())$ or $() ()$, but not $()) ($
 - important, almost all programming languages allow parentheses, need checking
 - PDA can do the trick, not FSM
- We call the class of languages acceptable by some PDA **context-free**.
- There are useful languages not context free.
 - $A^n B^n C^n = \{a^n b^n c^n : n \geq 0\}$
 - a stack wouldn't work. All popped out and get empty after counting b

Turing Machines

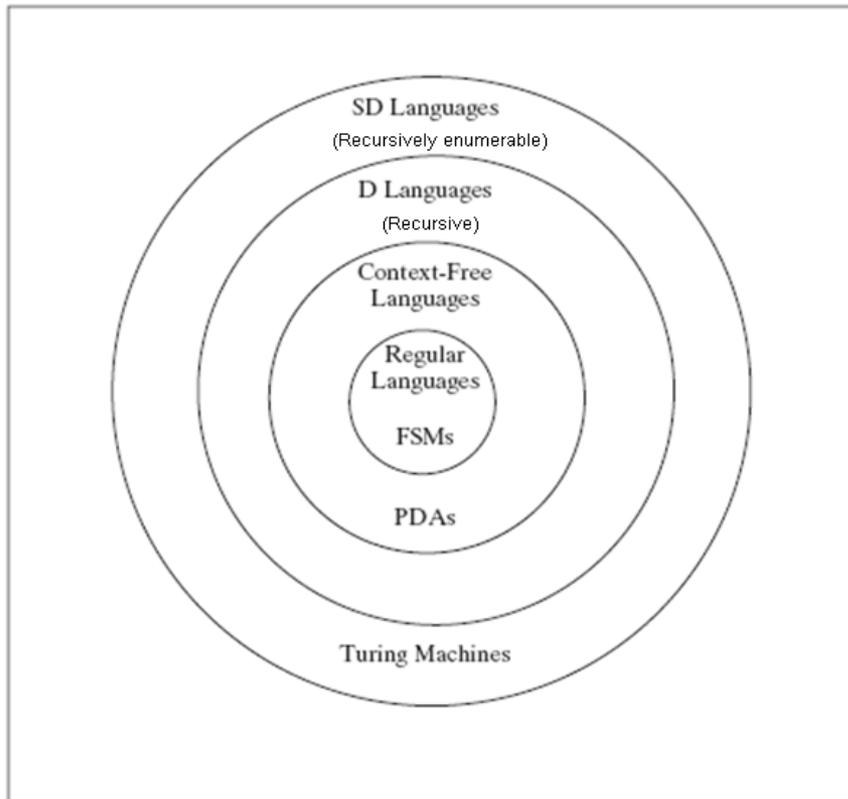
A Turing Machine to accept $A^nB^nC^n$:



Turing Machines

- FSM and PDA (exists some equivalent PDA) are guaranteed to halt.
- But not TM. Now use TM to define new classes of languages, D and SD
- A language L is in D iff there exists a TM M that halts on all inputs, accepts all strings in L , and rejects all strings not in L .
 - in other words, M can always say yes or no properly
- A language L is in SD iff there exists a TM M that accepts all strings in L and fails to accept every string not in L . Given a string not in L , M may reject or it may loop forever (no answer).
 - in other words, M can always say yes properly, but not no.
 - give up looking? say no?
 - $D \subset SD$
- $Bal, A^nB^n, A^nB^nC^n \dots$ are all in D
 - how about regular and context-free languages?
- In SD but D : $H = \{ \langle M, w \rangle : \text{TM } M \text{ halts on input string } w \}$
- Not even in SD : $H_{\text{all}} = \{ \langle M \rangle : \text{TM } M \text{ halts on all inputs} \}$

Languages and Machines

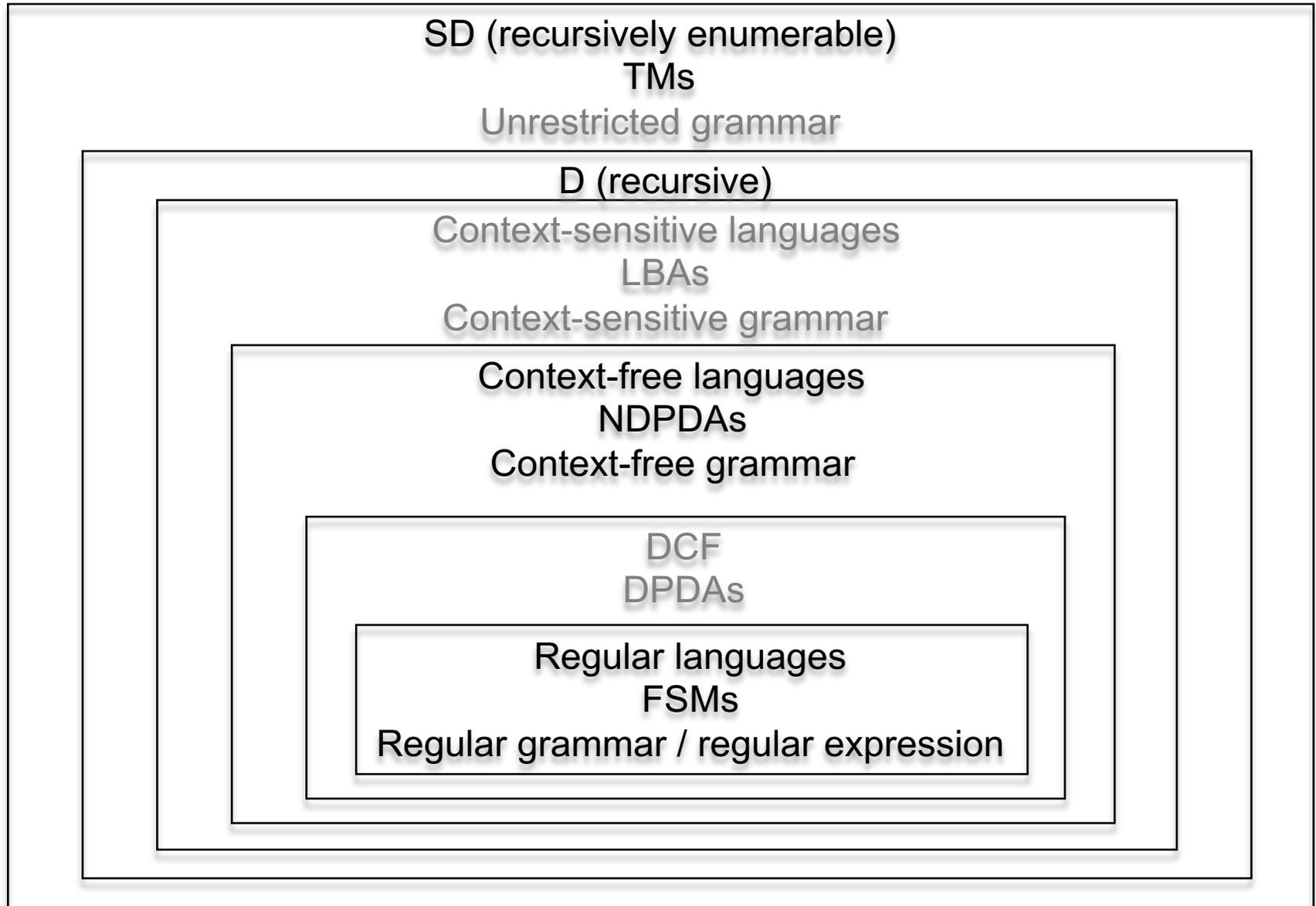


Hierarchy of language classes

Rule of Least Power:
“Use the least powerful language suitable for expressing information, constraints or programs on the World Wide Web.”

- Applies far more broadly.
- Expressiveness generally comes at a price
 - computational efficiency, decidability, clarity

Languages, Machines, and Grammars





A Tractability Hierarchy

- **P** : contains languages that can be decided by a TM in polynomial time
- **NP** : contains languages that can be decided by a nondeterministic TM (one can conduct a search by guessing which move to make) in polynomial time
- **PSPACE**: contains languages that can be decided by a machine with polynomial space

$$P \subseteq NP \subseteq PSPACE$$

- $P = NP$? Biggest open question for theorists



Decision Procedures

Chapter 4



Decidability Issues

Goal of the book: be able to make useful claims about problems and the programs that solve them.

- cast problems as language recognition tasks
- define programs as state machines whose input is a string and output is *Accept* or *Reject*



Decision Procedures

An ***algorithm*** is a detailed procedure that accomplishes some clearly specified task.

A ***decision procedure*** is an algorithm to solve a decision problem.

Decision procedures are programs and must possess two correctness properties:

- must halt on all inputs
- when it halts and returns an answer, it must be the correct answer for the given input

Decidability

- A decision problem is ***decidable*** iff there exists a decision procedure for it.
- A decision problem is ***undecidable*** iff there exists no a decision procedure for it.
- A decision problem is ***semidecidable*** iff there exists a semidecision procedure for it.
 - a semidecision procedure is one that halts and returns *True* whenever *True* is the correct answer. When *False* is the answer, it may either halt and return *False* or it may loop (no answer).
- Three kinds of problems:
 - decidable (recursive)
 - not decidable but semidecidable (recursively enumerable)
 - not decidable and not even semidecidable



Decidable

Checking for even numbers: Is the integer x even?

Let $/$ perform truncating integer division, then consider the following program:

```
even(x:integer)=  
    If  $(x/2)*2 = x$  then return True else return False
```

Is the program a decision procedure?



Undecidable but Semidecidable

Halting Problem: For any Turing machine M and input w , decide whether M halts on w .

- w is finite
- $H = \{ \langle M, w \rangle : \text{TM } M \text{ halts on input string } w \}$
- asks whether M enters an infinite loop for a particular input w

Java version: Given an arbitrary Java program p that takes a string w as an input parameter. Does p halt on some particular value of w ?

$\text{haltsOn}(p:\text{program}, w:\text{string}) =$

1. simulate the execution of p on w .
2. if the simulation halts return *True* else return *False*.

Is the program a decision procedure?

Not even Semidecidable

Halting-on-all (totality) Problem: For any Turing machine M , decide whether M halts on all inputs.

- $H_{ALL} = \{ \langle M \rangle : \text{TM } M \text{ halts on all inputs} \}$
- If it does, it computes a total function
- equivalent to the problem of whether a program can ever enter an infinite loop, for any input
- differs from the halting problem, which asks whether M enters an infinite loop for a particular input

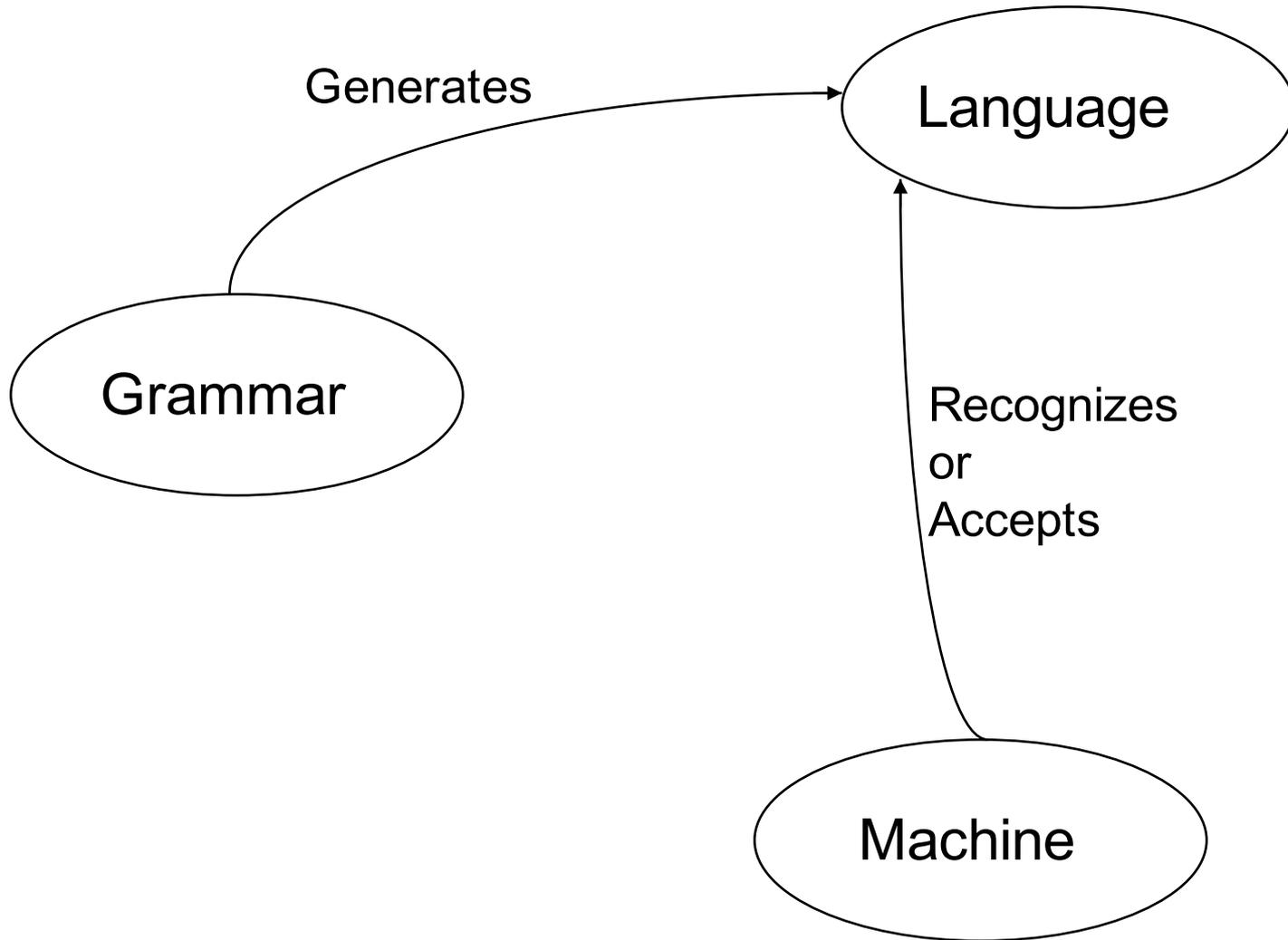
Java version: Given an arbitrary Java program p that takes a single string as input parameter. Does p halt on all possible input values?

$\text{haltsOnAll}(p:\text{program}) =$

1. for $i = 1$ to infinity do:
 simulate the execution of p on all possible input strings of length i .
2. if all the simulations halt return *True* else return *False*.

Is the program a decision procedure? A semidecision procedure?

Grammars, Languages, and Machines



Clarification

A machine M *recognizes* a language L iff M accepts all and only those strings in L .

A machine M *decides* a language L iff M accepts all strings in L and rejects all strings not in L .

recognize = accept = semi-decide \neq decide

When a machine halts, it must either accept or reject. So for machines that always halt, accept implies decide.

A language L is called semi-decidable iff some TM accepts L .

A language L is called decidable iff some TM decides L .

SD: set of semi-decidable languages

D: set of decidable languages (a subset of SD by definition. actually a proper subset of SD by proof)