

## Other Models of Computation

1

### Models of computation:

- Turing Machines
- Recursive Functions
- Post Systems
- Rewriting Systems

2

### Church's Thesis:

All models of computation are equivalent

### Turing's Thesis:

A computation is mechanical if and only if it can be performed by a Turing Machine

3

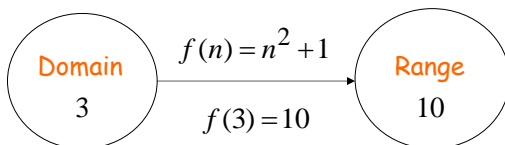
Church's and Turing's Thesis are similar:

Church-Turing Thesis

4

## Recursive Functions

An example function:



5

We need a way to define functions

We need a set of basic functions

6

### Basic Primitive Recursive Functions

Zero function:  $z(x) = 0$

Successor function:  $s(x) = x + 1$

Projection functions:  $p_1(x_1, x_2) = x_1$

$p_2(x_1, x_2) = x_2$

7

### Building complicated functions:

Composition:  $f(x, y) = h(g_1(x, y), g_2(x, y))$

Primitive Recursion:

$f(x, 0) = g_1(x)$

$f(x, y + 1) = h(g_2(x, y), f(x, y))$

8

Any function built from  
the basic primitive recursive functions  
is called:

Primitive Recursive Function

9

A Primitive Recursive Function:  $add(x, y)$

$add(x, 0) = x$  (projection)

$add(x, y + 1) = s(add(x, y))$

(successor function)

10

$$\begin{aligned} add(3, 2) &= s(add(3, 1)) \\ &= s(s(add(3, 0))) \\ &= s(s(3)) \\ &= s(4) \\ &= 5 \end{aligned}$$

11

Another Primitive Recursive Function:

$mult(x, y)$

$mult(x, 0) = 0$

$mult(x, y + 1) = add(x, mult(x, y))$

12

**Theorem:**

The set of primitive recursive functions is countable

**Proof:**

Each primitive recursive function can be encoded as a string

Enumerate all strings in proper order

Check if a string is a function

13

**Theorem**

there is a function that is not primitive recursive

**Proof:**

Enumerate the primitive recursive functions

$f_1, f_2, f_3, \dots$

14

**Define function**  $g(i) = f_i(i) + 1$

$g$  differs from every  $f_i$

$g$  is not primitive recursive

END OF PROOF

15

A specific function that is not Primitive Recursive:

**Ackermann's function:**

$$A(0, y) = y + 1$$

$$A(x, 0) = A(x - 1, 1)$$

$$A(x, y + 1) = A(x - 1, A(x, y))$$

Grows very fast,  
faster than any primitive recursive function

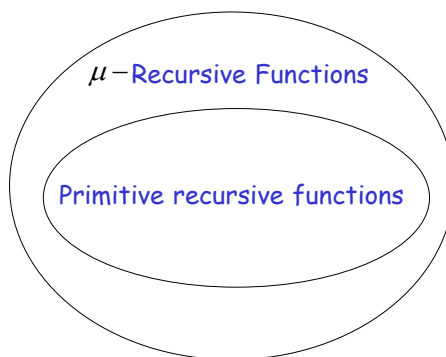
16

$\mu$ -Recursive Functions

$\mu y(g(x, y)) = \text{smallest } y \text{ such that } g(x, y) = 0$

Accerman's function is a  $\mu$ -Recursive Function

17



18

## Post Systems

- Have Axioms
- Have Productions

Very similar with unrestricted grammars

19

## Example: Unary Addition

Axiom:  $1+1=11$

Productions:

$$V_1 + V_2 = V_3 \rightarrow V_1 1 + V_2 = V_3 1$$

$$V_1 + V_2 = V_3 \rightarrow V_1 + V_2 1 = V_3 1$$

20

A production:

$$V_1 + V_2 = V_3 \rightarrow V_1 1 + V_2 = V_3 1$$

$$1+1=11 \Rightarrow 11+1=111 \Rightarrow 11+11=1111$$

$$V_1 + V_2 = V_3 \rightarrow V_1 + V_2 1 = V_3 1$$

21

Post systems are good for  
proving mathematical statements  
from a set of Axioms

22

**Theorem:**

A language is recursively enumerable  
if and only if  
a Post system generates it

23

## Rewriting Systems

They convert one string to another

- Matrix Grammars
- Markov Algorithms
- Lindenmayer-Systems

Very similar to unrestricted grammars

24

### Matrix Grammars

Example:  $P_1: S \rightarrow S_1 S_2$   
 $P_2: S_1 \rightarrow a S_1, S_2 \rightarrow b S_2 c$   
 $P_3: S_1 \rightarrow \lambda, S_2 \rightarrow \lambda$

Derivation:

$S \Rightarrow S_1 S_2 \Rightarrow a S_1 b S_2 c \Rightarrow aa S_1 bb S_2 cc \Rightarrow aabbcc$

A set of productions is applied simultaneously

25

$P_1: S \rightarrow S_1 S_2$   
 $P_2: S_1 \rightarrow a S_1, S_2 \rightarrow b S_2 c$   
 $P_3: S_1 \rightarrow \lambda, S_2 \rightarrow \lambda$

$$L = \{a^n b^n c^n : n \geq 0\}$$

Theorem:

A language is recursively enumerable  
 if and only if  
 a Matrix grammar generates it

26

### Markov Algorithms

Grammars that produce  $\lambda$

Example:  $ab \rightarrow S$   
 $aSb \rightarrow S$   
 $S \rightarrow \lambda$

Derivation:

$aaabbb \Rightarrow aaSbb \Rightarrow aSb \Rightarrow S \Rightarrow \lambda$

27

$ab \rightarrow S$   
 $aSb \rightarrow S$   
 $S \rightarrow \lambda$

$$L = \{a^n b^n : n \geq 0\}$$

28

In general:  $L = \{w : w \xRightarrow{*} \lambda\}$

Theorem:

A language is recursively enumerable  
 if and only if  
 a Markov algorithm generates it

29

### Lindenmayer-Systems

They are parallel rewriting systems

Example:  $a \rightarrow aa$

Derivation:  $a \Rightarrow aa \Rightarrow aaaa \Rightarrow aaaaaaaaa$

$$L = \{a^{2^n} : n \geq 0\}$$

30

Lindenmayer-Systems are not general  
As recursively enumerable languages

Extended Lindenmayer-Systems:  $(x, a, y) \rightarrow u$   


**Theorem:**

A language is recursively enumerable  
if and only if an  
Extended Lindenmayer-System generates it

31

## Computational Complexity

32

**Time Complexity:** The number of steps  
during a computation

**Space Complexity:** Space used  
during a computation

33

## Time Complexity

- We use a multitape Turing machine
- We count the number of steps until a string is accepted
- We use the  $O(k)$  notation

34

**Example:**  $L = \{a^n b^n : n \geq 0\}$

**Algorithm to accept a string  $w$  :**

- Use a two-tape Turing machine
- Copy the  $a$  on the second tape
- Compare the  $a$  and  $b$

35

$L = \{a^n b^n : n \geq 0\}$

**Time needed:**

- Copy the  $a$  on the second tape  $O(|w|)$
- Compare the  $a$  and  $b$   $O(|w|)$

**Total time:**  $O(|w|)$

36

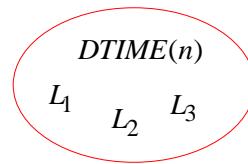
$$L = \{a^n b^n : n \geq 0\}$$

For string of length  $n$

time needed for acceptance:  $O(n)$

37

Language class:  $DTIME(n)$



A Deterministic Turing Machine  
accepts each string of length  $n$   
in time  $O(n)$

38

$DTIME(n)$

$\{a^n b^n : n \geq 0\}$

$\{ww\}$

39

In a similar way we define the class

$DTIME(T(n))$

for any time function:  $T(n)$

Examples:  $DTIME(n^2), DTIME(n^3), \dots$

40

Example: The membership problem  
for context free languages

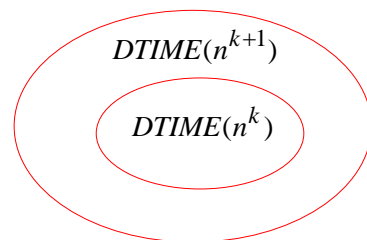
$L = \{w : w \text{ is generated by grammar } G\}$

$L \in DTIME(n^3)$  (CYK - algorithm)

Polynomial time

41

Theorem:  $DTIME(n^{k+1}) \subset DTIME(n^k)$



42

Polynomial time algorithms:  $DTIME(n^k)$

Represent tractable algorithms:

For small  $k$  we can compute the result fast

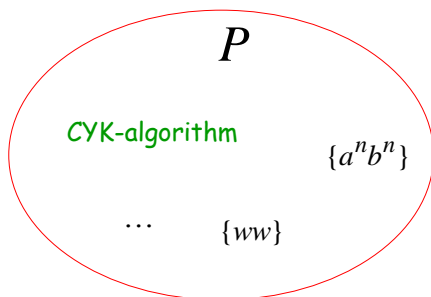
43

The class  $P$

$$P = \cup DTIME(n^k) \quad \text{for all } k$$

- Polynomial time
- All tractable problems

44



45

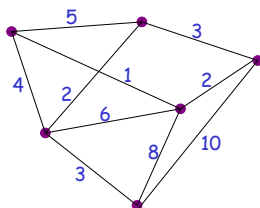
Exponential time algorithms:  $DTIME(2^n)$

Represent intractable algorithms:

Some problem instances may take centuries to solve

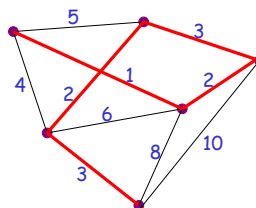
46

Example: the Traveling Salesperson Problem



Question: what is the shortest route that connects all cities?

47



Question: what is the shortest route that connects all cities?

48



A solution: search exhaustively all  
hamiltonian paths

$L = \{\text{shortest hamiltonian paths}\}$

$L \in DTIME(n!) \approx DTIME(2^n)$

Exponential time

Intractable problem

49

## Example: The Satisfiability Problem

Boolean expressions in  
Conjunctive Normal Form:

$$t_1 \wedge t_2 \wedge t_3 \wedge \cdots \wedge t_k$$

$$t_i = x_1 \vee \bar{x}_2 \vee x_3 \vee \cdots \vee \bar{x}_p$$

Variables

Question: is expression satisfiable?

50

Example:  $(\bar{x}_1 \vee x_2) \wedge (x_1 \vee x_3)$

Satisfiable:  $x_1 = 0, x_2 = 1, x_3 = 1$

$$(\bar{x}_1 \vee x_2) \wedge (x_1 \vee x_3) = 1$$

51

Example:  $(x_1 \vee x_2) \wedge \bar{x}_1 \wedge \bar{x}_2$

Not satisfiable

52

$L = \{w : \text{expression } w \text{ is satisfiable}\}$

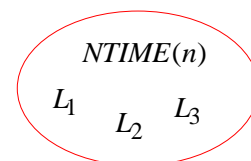
For  $n$  variables:  $L \in DTIME(2^n)$   
exponential

Algorithm:  
search exhaustively all the possible  
binary values of the variables

53

## Non-Determinism

Language class:  $NTIME(n)$



A Non-Deterministic Turing Machine  
accepts each string of length  $n$   
in time  $O(n)$

54

Example:  $L = \{ww\}$

Non-Deterministic Algorithm  
to accept a string  $ww$  :

- Use a two-tape Turing machine
- Guess the middle of the string and copy  $w$  on the second tape
- Compare the two tapes

55

$L = \{ww\}$

Time needed:

- Use a two-tape Turing machine
  - Guess the middle of the string and copy  $w$  on the second tape  $O(|w|)$
  - Compare the two tapes  $O(|w|)$
- Total time:  $O(|w|)$

56

$NTIME(n)$

$L = \{ww\}$

57

In a similar way we define the class

$NTIME(T(n))$

for any time function:  $T(n)$

Examples:  $NTIME(n^2), NTIME(n^3), \dots$

58

Non-Deterministic Polynomial time algorithms:

$L \in NTIME(n^k)$

59

The class  $NP$

$P = \cup NTIME(n^k)$  for all  $k$

Non-Deterministic Polynomial time

60

Example: The satisfiability problem

$$L = \{w : \text{expression } w \text{ is satisfiable}\}$$

Non-Deterministic algorithm:

- Guess an assignment of the variables
- Check if this is a satisfying assignment

61

$$L = \{w : \text{expression } w \text{ is satisfiable}\}$$

Time for  $n$  variables:

- Guess an assignment of the variables  $O(n)$
- Check if this is a satisfying assignment  $O(n)$

Total time:  $O(n)$

62

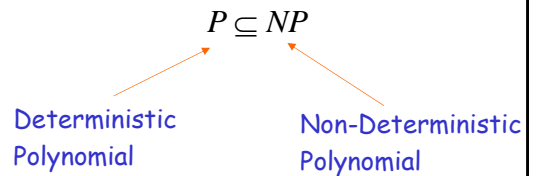
$$L = \{w : \text{expression } w \text{ is satisfiable}\}$$

$$L \in NP$$

The satisfiability problem is an  $NP$ - Problem

63

Observation:



64

Open Problem:  $P = NP ?$

WE DO NOT KNOW THE ANSWER

65

Open Problem:  $P = NP ?$

Example: Does the Satisfiability problem have a polynomial time deterministic algorithm?

WE DO NOT KNOW THE ANSWER

66

## NP-Completeness

A problem is NP-complete if:

- It is in NP
- Every NP problem is reduced to it  
(in polynomial time)

67

### Observation:

If we can solve any NP-complete problem  
in Deterministic Polynomial Time (P time)  
then we know:

$$P = NP$$

68

### Observation:

If we prove that  
we cannot solve an NP-complete problem  
in Deterministic Polynomial Time (P time)  
then we know:

$$P \neq NP$$

69

### Cook's Theorem:

The satisfiability problem is NP-complete

### Proof:

Convert a Non-Deterministic Turing Machine  
to a Boolean expression  
in conjunctive normal form

70

### Other NP-Complete Problems:

- The Traveling Salesperson Problem
- Vertex cover
- Hamiltonian Path

All the above are reduced  
to the satisfiability problem

71

### Observations:

It is unlikely that NP-complete  
problems are in P

The NP-complete problems have  
exponential time algorithms

Approximations of these problems  
are in P

72