

Last time:

M has running time T , for $T: \mathbb{N} \rightarrow \mathbb{N}$, where

$$T(n) = \max \{ \# \text{ of steps } M \text{ takes in the} \\ \text{worst case over all inputs } w \in \Sigma^* \\ \text{and over all computation choices} \\ \text{if } M \text{ is an NTM} \}$$

$$\text{NTIME}(T(\cdot)) = \{ A \mid \text{some multitape NTM with} \\ \text{language "set of strings"} \\ \text{"yes/no question"} \\ \text{running time } O(T(n)) \text{ decides } A \}$$

Thm $\text{TIME}(T(n)) \subseteq \text{NTIME}(T(n)) \subseteq \bigcup_{c>0} \text{TIME}(2^{cT(n)})$
 $\text{NTIME}(2^{O(T(n))})$

polynomial time $P = \bigcup_k \text{TIME}(n^k)$ $\text{TIME}(n^{O(1)})$

non-deterministic polynomial time $NP = \bigcup_k \text{NTIME}(n^k)$ $\text{NTIME}(n^{O(n)})$

Note: • $P \subseteq NP$ (every TM is an NTM)

• P is a set of languages (decision problems)

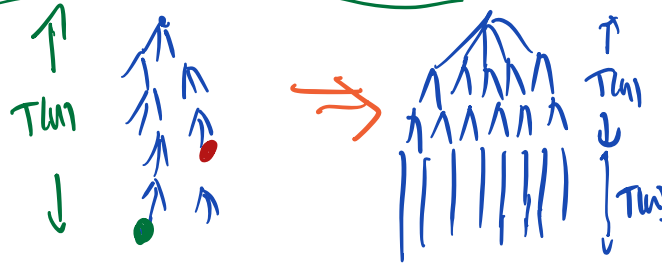
FP is the set of polynomial-time computable functions

RELPRIME $\in P$, VARY $\in P$

FACTOR = $\{ \langle N, k, l \rangle : \text{integer } N \text{ has a factor } m \text{ with } k \leq m \leq l \}$

FACTOR $\in NP$ EP? open

Normal Form for NTM:



sequence of moves
"addresses" of
leaf of NTM tree.

Guess of length $T(n)$ that only depends on input length n .
Verify of length $T(n)$

Check that following guess is consistent and leads to accepting.

Thm For every regular language A
 $A \in TIME(n)$

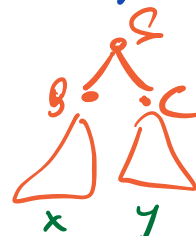
Proof: Use TM corresponding to DFA for A .
On input of length n takes n steps \square

Thm For every CFL A , $A \in TIME(n^3)$

Proof Uses Chomsky Normal Form and dynamic programming

parse tree is binary.
 $A \rightarrow BC$

Strings of length n is finite.
so decidable



x, y strictly shorter than w

Cocke-Kasami-Younger algorithm idea:

Every variable B in a parse tree for w generates a substring of w , defined by some indices $i \leq j$.

Use dynamic programming.

See slides

Textbook: COMPOSITES = $\{ \langle N \rangle : N \text{ is an integer s.t. } \exists p, q \text{ s.t. } pq = N, 1 < p, q < N \}$

$\langle N \rangle \in \text{COMPOSITES} \iff \langle N, 2, N-1 \rangle \in \text{FACTOR}$
↗ NP

Thm 1 $A \in \text{NP}$ class

\iff ② \exists deterministic polytime TM V (a "verifier") s.t.
 $\forall x. x \in A \iff \exists y. |y| \text{ is } |x|^{O(1)}$
↗ and V accepts $\langle x, y \rangle$.

\iff ③ text \exists deterministic TM V' s.t. V' on input $\langle x, c \rangle$
runs in time polynomial in $|x|$ and
 $\forall x. x \in A \iff \exists c \text{ s.t. } V' \text{ accepts } \langle x, c \rangle$

↖ "certificate" or "proof" that $x \in A$

Example using defn ②:
COMPOSITES $\in \text{NP}$:

For input N a bit

Certificate: integers p, q each at most $\log_2 N$ bits

Verify: check that $N = p \cdot q$ time at most $O(\log^2 N)$

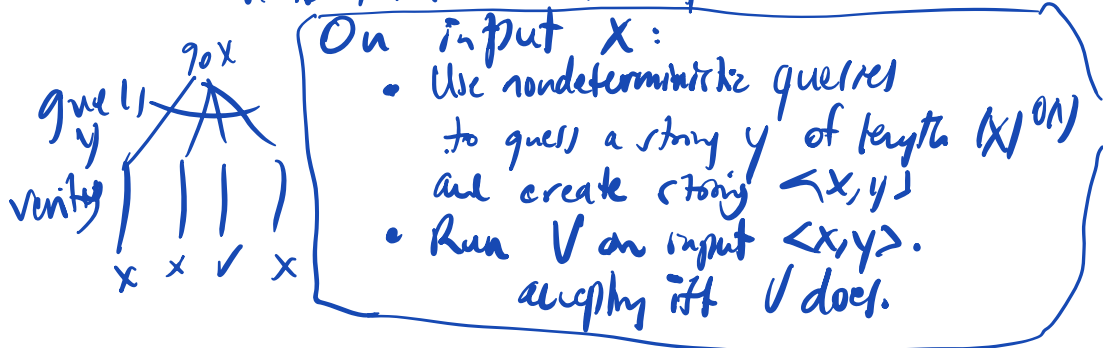
Proof of Thm

First observe that $(2) \Leftrightarrow (3)$

$(2) \Rightarrow (3)$: We can use $c=y$ and $V'=V$
easy $|y|$ is only $|x|^{O(1)}$ so total running time of V' is $|x|^{O(1)}$ as required

$(3) \Rightarrow (2)$: Suppose there is such a V' . We use $V=V'$. Since V' runs in $|x|^{O(1)}$ time, it only can look at $1 + |x|^{O(1)}$ bits of c . Let y be those bits.
a bit harder

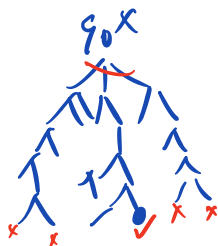
$(2) \Rightarrow (1)$: Given verifier V for A :
 Create NTM for A as follows:



$(1) \Rightarrow (2)$: Total time is polynomial.

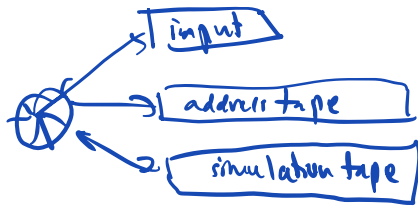
Suppose we have an NTM M for A :
 In general M will have a computation tree that branches at any time

more detail on normal form



address of nodes sequence of more choices starting from root.

Recall simulation of NTM_r by TM's: (BFS of tree)



- steps:
- copy input to tape 3
 - use address tape on tape 2 to deterministically simulate on tape 3. If M accepts then accept.
 - increment address & repeat.

Idea here: certificate y is a possible address of polynomial length \rightarrow verification V checks that simulation on input x using address string y accepts. \square

poly time since # of steps = length of y .

More examples in NP:

HAMPATH = $\{ \langle G \rangle : G \text{ is a directed graph with a path that touches each vertex exactly once} \}$

HAMPATH \in NP:

On input $\langle G \rangle$: $n = \#$ vertices of G

poly length $\left\{ \begin{array}{l} \text{Certificate: sequence of vertices of length } n \end{array} \right.$

poly time $\left\{ \begin{array}{l} \text{verify: } \bullet \text{ all vertices are different} \\ \bullet \text{ each adjacent pair of vertices } u, v \text{ has a directed edge } (u, v) \text{ in } G \end{array} \right.$

SAT ∈ {⟨ϕ⟩ : ϕ is a Boolean (propositional logic) formula that is satisfiable}
 has a truth assignment that makes it true.

SAT ∈ NP :
 poly length Certificate : truth assignment α
 polytime Verify ϕ evaluates to true under assignment α
 (and ϕ is a Boolean formula)

CNFSAT = {⟨ϕ⟩ : ϕ is a satisfiable formula in conjunctive Normal Form (CNF)}

Recall CNF from 311: (aka. "product of sums")

Recall: A CNF is an \wedge of clauses
 a clause is an \vee of literals
 a literal is a propositional logic variable or its negator, x_i or $\overline{x_i}$



CNFSAT ∈ NP :
 • same certificate as SAT
 • only change is that Verifier checks that ϕ is a CNF in addition to checking α.

Defⁿ kCNF formula is a CNF formula where each clause has length ≤ k (≤ k literals)

RSAT = {⟨ϕ⟩ : ϕ is a satisfiable kCNF}

RSAT ∈ NP : as before but checks kCNF format for input, too.

Relation among problems

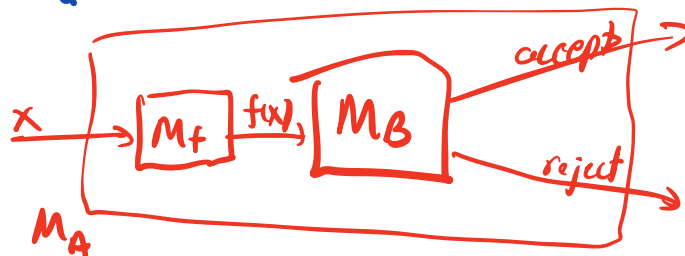
Def Given $A, B ⊆ Σ^*$, A is polynomial-time mapping reducible to B written $A ≤_p B$, or $A ≤_m^D B$ iff there is a polytime computable $f: Σ^* → Σ^*$ st. $∀ x ∈ Σ^*, x ∈ A ⇔ f(x) ∈ B$

only difference from $A ≤_m B$

Thm . If $A ≤_m^D B$ and $B ∈ P$ then $A ∈ P$

• If $A ≤_m^D B$ and $B ∈ NP$ then $A ∈ NP$

Proof . As usual given ^{polytime} machines M_B for B and M_f for reduction f define



This is correct as always. Only need to check run time

Since both are polynomials: let runtime of M_f be $O(n^k)$
- - M_B be $O(n^l)$

Total runtime for M_A on input x

$$O(|x|^k) + O(|f(x)|^l)$$

which is $O(|x|^k) + O([O(|x|^k)]^l)$

since size of output
at most runtime

which $O(|x|^{kl})$
& is polynomial

For NTM same argument applies



Summary:

$A \leq_m^P B$
"A is at most
as hard as B
up to "polynomial
step"

- polynomial-time mapping reductions
 $A \leq_m^P B$ (or $A \leq_p B$)
just like defⁿ of mapping reduction
except f must be poly time
computable

Then

- IF $A \leq_m^P B$ and $B \in P$ then $A \in P$
- IF $A \leq_m^P B$ and $B \in NP$ then $A \in NP$

We now add defⁿs:

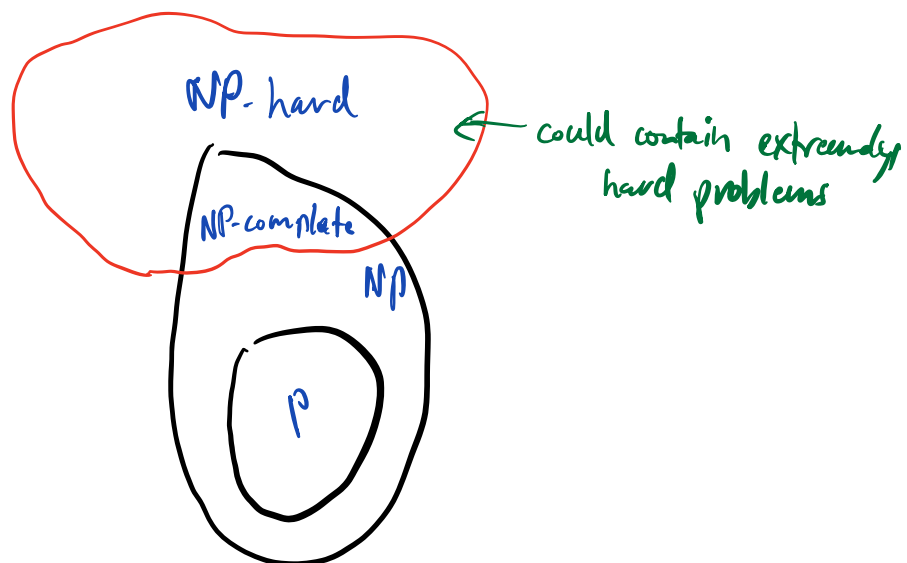
Defⁿ • B is NP-hard iff $\forall A \in \text{NP} . A \leq_m^p B$

Defⁿ • B is NP-complete iff

- $B \in \text{NP}$ and
- B is NP-hard

Con If some NP-hard problem is in P then $P = \text{NP}$.

We now look at a picture of these classes



Thm [Cook, Levin] 3SAT is NP-complete
^{↑ special case of SAT for 3CNF formulas}

We prove this via a different SAT problem:

CIRCUIT-SAT = $\{ \langle C \rangle : C \text{ is a Boolean circuit s.t.} \exists \text{ input } y \text{ s.t. } C(y) = 1 \}$

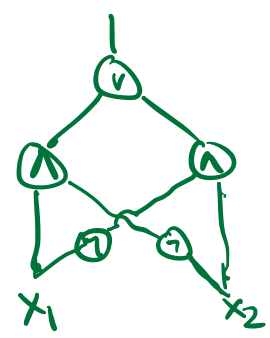
Boolean circuit: inputs x_1, \dots, x_n

gates: (bottom up) \vee OR \wedge AND \neg NOT

Given by graph: output gate special marked gate.

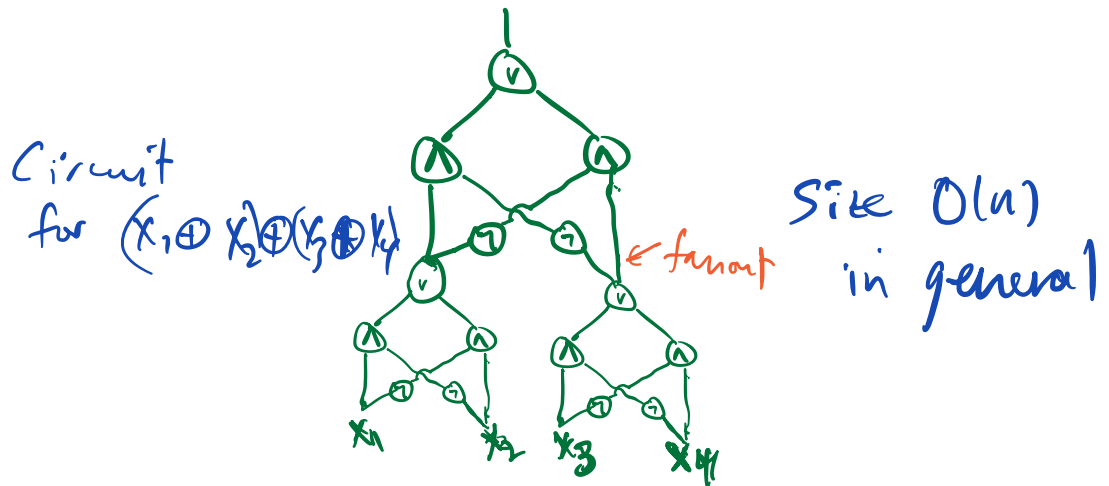
Computes a Boolean function $f: \{0,1\}^n \rightarrow \{0,1\}$

eg. Parity, aka. XOR
 $x_1 \oplus x_2$



↑ size = # gates
 ↓ depth = length of longest path from input to output.

eg Can combine these units into a larger circuit for function like $x_1 \oplus x_2 \oplus \dots \oplus x_n$



Without fan-out \wedge, \vee, \neg takes $O(n^2)$ gates to compute $x_1 \oplus x_2 \oplus \dots \oplus x_n$

Note: TMs work on inputs of all lengths
Circuits only work for a fixed input length

Next time:

Thm (Shannon) Almost all functions on n bits require circuit size $\Omega(2^n/n)$