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- The set of all programs is countable, the set of all problems is uncountable.
- P computes F is for every x, P(x) output F(x) and halts.
- Strings (definition: 1) empty string, 2) ax, where a is an element of  $\Sigma$  and x is a string

Length of string	Concatenation of string
$ w  := \begin{cases} 0 & \text{if } w = \varepsilon, \\ 1 +  x  & \text{if } w = ax. \end{cases}$	$w \bullet z := \begin{cases} z & \text{if } w = \varepsilon, \\ a \cdot (x \bullet z) & \text{if } w = ax. \end{cases}$
<p><b>Proof:</b> Let w be an arbitrary string.</p> <p>Assume, for every string x such that <math> x  &lt;  w </math>, that x is perfectly cromulent.</p> <p>There are two cases to consider.</p> <ul style="list-style-type: none"><li>• Suppose <math>w = \varepsilon</math>.</li></ul> <div></div> <p>Therefore, w is perfectly cromulent.</p> <ul style="list-style-type: none"><li>• Suppose <math>w = ax</math> for some symbol a and string x.</li></ul> <p>The induction hypothesis implies that x is perfectly cromulent.</p> <div></div> <p>Therefore, w is perfectly cromulent.</p> <p>In both cases, we conclude that w is perfectly cromulent.</p>	

- Languages

<p><b>Lemma 2.1:</b> for all languages A, B and C</p> <p>(a) <math>\emptyset A = A\emptyset = \emptyset</math>.</p> <p>(b) <math>\varepsilon A = A\varepsilon = A</math>.</p> <p>(c) <math>A + B = B + A</math>.</p> <p>(d) <math>(A + B) + C = A + (B + C)</math>.</p> <p>(e) <math>(AB)C = A(BC)</math>.</p> <p>(f) <math>A(B + C) = AB + AC</math>.</p>	<p><b>Lemma 2.2.</b> The following identities hold for every language L:</p> <p>(a) <math>L^* = \varepsilon + L^+ = L^*L^* = (L + \varepsilon)^* = (L \setminus \varepsilon)^* = \varepsilon + L + L^+L^+</math>.</p> <p>(b) <math>L^+ = L^* \setminus \varepsilon = LL^* = L^*L = L^+L^* = L^*L^+ = L + L^+L^+</math>.</p> <p>(c) <math>L^+ = L^*</math> if and only if <math>\varepsilon \in L</math>.</p>
<p><b>Lemma 2.3 (Arden's Rule).</b> For any languages A, B, and L such that <math>L = AL + B</math>, we have <math>A^*B \subseteq L</math>. Moreover, if A does not contain the empty string, then <math>L = AL + B</math> if and only if <math>L = A^*B</math>.</p>	

- Regular Language (Note:  $L^+ = LL^*$ )

<p><b>Definition</b></p> <ul style="list-style-type: none"><li>• L is empty;</li><li>• L contains a single string (which could be the empty string <math>\varepsilon</math>);</li><li>• L is the union of two regular languages;</li><li>• L is the concatenation of two regular languages; or</li><li>• L is the Kleene closure of a regular language.</li></ul>
Regular Expression Tree

- A leaf node labeled  $\emptyset$ .
- A leaf node labeled with a string in  $\Sigma^*$ .
- A node labeled + with two children, each of which is the root of a regular expression tree.
- A node labeled  $\bullet$  with two children, each of which is the root of a regular expression tree.
- A node labeled \* with one child, which is the root of a regular expression tree.

<p><b>Proof:</b> Let R be an arbitrary regular expression.</p> <p>Assume that every proper subexpression of R is perfectly cromulent.</p> <p>There are five cases to consider.</p> <ul style="list-style-type: none"><li>• Suppose <math>R = \varepsilon</math>.</li></ul> <div></div> <p>Therefore, R is perfectly cromulent.</p> <ul style="list-style-type: none"><li>• Suppose R is a single string.</li></ul> <div></div> <p>Therefore, R is perfectly cromulent.</p> <ul style="list-style-type: none"><li>• Suppose <math>R = S + T</math> for some regular expressions S and T.</li></ul> <p>The induction hypothesis implies that S and T are perfectly cromulent.</p> <div></div> <p>Therefore, R is perfectly cromulent.</p> <ul style="list-style-type: none"><li>• Suppose <math>R = S \bullet T</math> for some regular expressions S and T.</li></ul> <p>The induction hypothesis implies that S and T are perfectly cromulent.</p> <div></div> <p>Therefore, R is perfectly cromulent.</p> <ul style="list-style-type: none"><li>• Suppose <math>R = S^*</math> for some regular expression S.</li></ul> <p>The induction hypothesis implies that S is perfectly cromulent.</p> <div></div> <p>Therefore, w is perfectly cromulent.</p> <p>In both cases, we conclude that w is perfectly cromulent.</p>
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- DFA/NFA  $M = (\Sigma, Q, \delta, s, F)$  Note: for DFA  $\delta = Q \times \Sigma \rightarrow Q$ , for NFA  $\delta = Q \times \Sigma \rightarrow 2^Q = \mathbb{P}(Q)$

For two regular languages L and L'

- $\overline{L} = \Sigma^* \setminus L$  is regular.
- $L \cap L'$  is regular.
- $L \setminus L'$  is regular.
- $L \oplus L'$  is regular.

- Fooling set example

<p><b>Lemma 3.7.</b> The language <math>L = \{ww^R \mid w \in \Sigma^*\}</math> of even-length palindromes is not regular.</p> <p><b>Proof:</b> Let x and y be arbitrary distinct strings in <math>\emptyset^*1</math>. Then we must have <math>x = \emptyset^i1</math> and <math>y = \emptyset^j1</math> for some integers <math>i \neq j</math>. The suffix <math>z = 1\emptyset^i</math> distinguishes x and y, because <math>xz = \emptyset^i11\emptyset^i \in L</math>, but <math>yz = \emptyset^i11\emptyset^j \notin L</math>. We conclude that <math>\emptyset^*1</math> is a fooling set for L. Because <math>\emptyset^*1</math> is infinite, L cannot be regular. <span style="float: right;">□</span></p>
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- NFA to DFA – subset construction example

$q'$	$\epsilon\text{-reach}(q')$	$q' \in A'$ ?	$\delta'(q', \emptyset)$	$\delta'(q', 1)$
$s$	$s$		$as$	$bs$
$as$	$as$		$acs$	$bs$
$bs$	$bs$		$as$	$bcs$
$acs$	$acs$	✓	$acs$	$bcs$
$bcs$	$bcs$	✓	$acs$	$bcs$

#### - Regular Expression to DFA

$R = \emptyset, L(R) = \emptyset$		$R = \epsilon, L(R) = \{\epsilon\}$	
$R = a, L(R) = \{a\}$		$R = ST, L(R) = L(S) \cdot L(T)$	
$R = S + T, L(R) = L(S) \cup L(T)$		$R = S^*, L(R) = L(S)^*$	

- Context Free Grammar  $G = (\Sigma, V, P, S)$  ( $\Sigma$  terminals,  $V$  non-terminals,  $P$  production rules,  $S$  start symbol)

- A string  $w$  is ambiguous with respect to a grammar if there is more than one parse tree for  $w$ ,

and a grammar  $G$  is ambiguous if some string is ambiguous with respect to  $G$ .

- A context-free language  $L$  is inherently ambiguous if every context-free grammar that generates  $L$  is ambiguous.

- Proof of correctness of grammar, example

In fact, it is not hard to *prove* by induction that  $L(C) = \{\emptyset^n 1^n \mid n \geq 0\}$  as follows. As usual when we prove that two sets  $X$  and  $Y$  are equal, the proof has two stages: one stage to prove  $X \subseteq Y$ , the other to prove  $Y \subseteq X$ .

- First we prove that  $C \rightsquigarrow^* \emptyset^n 1^n$  for every non-negative integer  $n$ .

Fix an arbitrary non-negative integer  $n$ . Assume that  $C \rightsquigarrow^* \emptyset^k 1^k$  for every non-negative integer  $k < n$ . There are two cases to consider.

- If  $n = 0$ , then  $\emptyset^n 1^n = \epsilon$ . The rule  $C \rightarrow \epsilon$  implies that  $C \rightsquigarrow \epsilon$  and therefore  $C \rightsquigarrow^* \epsilon$ .
- Suppose  $n > 0$ . The inductive hypothesis implies that  $C \rightsquigarrow^* \emptyset^{n-1} 1^{n-1}$ . Thus, the rule  $C \rightarrow \emptyset C 1$  implies that  $C \rightsquigarrow \emptyset C 1 \rightsquigarrow^* \emptyset(\emptyset^{n-1} 1^{n-1})1 = \emptyset^n 1^n$ .

In both cases, we conclude that that  $C \rightsquigarrow^* \emptyset^n 1^n$ , as claimed.

- Next we prove that for every string  $w \in \Sigma^*$  such that  $C \rightsquigarrow^* w$ , we have  $w = \emptyset^n 1^n$  for some non-negative integer  $n$ .

Fix an arbitrary string  $w$  such that  $C \rightsquigarrow^* w$ . Assume that for any string  $x$  such that  $|x| < |w|$  and  $C \rightsquigarrow^* x$ , we have  $x = \emptyset^k 1^k$  for some non-negative integer  $k$ . There are two cases to consider, one for each production rule.

- If  $w = \epsilon$ , then  $w = \emptyset^0 1^0$ .
- Suppose  $w = \emptyset x 1$  for some string  $x$  such that  $C \rightsquigarrow^* x$ . Because  $|x| = |w| - 2 < |w|$ , the inductive hypothesis implies that  $x = \emptyset^k 1^k$  for some integer  $k$ . Then we have  $w = \emptyset^{k+1} 1^{k+1}$ .

In both cases, we conclude that that  $w = \emptyset^n 1^n$  for some non-negative integer  $n$ , as claimed.

- Turing Machine  $M = (Q, \Sigma, \Gamma, B, \delta, q_{start}, q_{accept}, q_{reject})$  (Note  $B$  or  $\square$  is the blank symbol,  $\Sigma = \Gamma \setminus B$ ,  $\delta = Q \times \Gamma(\text{read}) \rightarrow Q \times \Gamma(\text{write}) \times \{L, R\}$ )

-  $M$  recognizes or accepts  $L$  if and only if  $M$  accepts every string in  $L$  but nothing else. (recursively enumerable language)

-  $M$  decides  $L$  if and only if  $M$  accepts every string in  $L$  and rejects every string in  $\Sigma^* \setminus L$ . A language is decidable (or computable or recursive) if it is decided by some Turing machine. (recursive language)

- MergeSort  $O(n \log n)$ , Median of Median  $O(n)$  (with large constant)

- Divide and conquer: split into  $n/c$ . Backtracking: split into  $n - c$

- Dynamic Programming Rubric

- 6 points for a correct recurrence, described either using mathematical notation or as pseudocode for a recursive algorithm.
  - + 1 point for a clear **English** description of the function you are trying to evaluate. (Otherwise, we don't even know what you're trying to do.) **Automatic zero if the English description is missing.**
  - + 1 point for stating how to call your function to get the final answer.
  - + 1 point for base case(s).  $-\frac{1}{2}$  for one *minor* bug, like a typo or an off-by-one error.
  - + 3 points for recursive case(s).  $-1$  for each *minor* bug, like a typo or an off-by-one error. **No credit for the rest of the problem if the recursive case(s) are incorrect.**
- 4 points for details of the dynamic programming algorithm
  - + 1 point for describing the memoization data structure
  - + 2 points for describing a correct evaluation order; a clear picture is usually sufficient. If you use nested loops, be sure to specify the nesting order.
  - + 1 point for time analysis

- Greedy Algorithm always need to be proved

- Assume that there is an optimal solution that is different from the greedy solution.
- Find the "first" difference between the two solutions.
- Argue that we can exchange the optimal choice for the greedy choice without degrading the solution.

- Graph

Comparison of different representations

	Adjacency matrix	Standard adjacency list (linked lists)	Adjacency list (hash tables)
Space	$\Theta(V^2)$	$\Theta(V + E)$	$\Theta(V + E)$
Time to: Test if $uv \in E$	$O(1)$	$O(1 + \min\{\deg(u), \deg(v)\}) = O(V)$	$O(1)$
Test if $u \rightarrow v \in E$	$O(1)$	$O(1 + \deg(u)) = O(V)$	$O(1)$
List $v$ 's neighbors	$O(V)$	$O(1 + \deg(v))$	$O(1 + \deg(v))$
List all edges	$\Theta(V^2)$	$\Theta(V + E)$	$\Theta(V + E)$
Insert edge $uv$	$O(1)$	$O(1)$	$O(1)^*$
Delete edge $uv$	$O(1)$	$O(\deg(u) + \deg(v)) = O(V)$	$O(1)^*$

Traverse

(with remembering)

<b>TRAVERSE(s):</b> put $s$ into the bag while the bag is not empty take $v$ from the bag if $v$ is unmarked mark $v$ for each edge $vw$ put $w$ into the bag	<b>TRAVERSE(s):</b> put $(\emptyset, s)$ in bag while the bag is not empty take $(p, v)$ from the bag (*) if $v$ is unmarked mark $v$ parent( $v$ ) $\leftarrow p$ for each edge $vw$ (†) put $(v, w)$ into the bag (**)
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Stack: LIFO (DFS)  $O(|V| + |E|)$ . If graph is connected  $O(|E|)$

Queue: FIFO (BFS)  $O(|V| + |E|)$ . If graph is connected  $O(|E|)$

Priority queue: lightest out (shortest first search)  $O(|V| + |E| \log |E|)$ .

If graph is connected  $O(|E| \log |E|)$

DFS  $O(|V| + |E|)$

(for directed graph)

<u>DFS(v):</u> mark v <i>PREVISIT(v)</i> for each edge v→w if w is unmarked <i>parent(w) ← v</i> DFS(w) <i>POSTVISIT(v)</i>	<u>DFSALL(G):</u> for all vertices v unmark v for all vertices v if v is unmarked DFS(v)	<u>DFS(v):</u> mark v PREVISIT(v) <i>for each edge v→w</i> if w is unmarked DFS(w) POSTVISIT(v)
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Is it a DAG (directed acyclic graph)? Time  $O(|V| + |E|)$

<u>ISACYCLIC(G):</u> add vertex s for all vertices $v \neq s$ add edge $s \rightarrow v$ <i>status(v) ← NEW</i> return ISACYCLICDFS(s)	<u>ISACYCLICDFS(v):</u> <i>status(v) ← ACTIVE</i> for each edge $v \rightarrow w$ if <i>status(w) = ACTIVE</i> return FALSE else if <i>status(w) = NEW</i> if ISACYCLICDFS(w) = FALSE return FALSE <i>status(v) ← DONE</i> return TRUE
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Topological Sort (The order by which vertices are DONE in DFS is a reverse topological order).

<u>PROCESSBACKWARD(G):</u> add vertex s for all vertices $v \neq s$ add edge $s \rightarrow v$ <i>status(v) ← NEW</i> PROCESSPOSTORDERDFS(s)	<u>PROCESSPOSTORDERDFS(v):</u> <i>status(v) ← ACTIVE</i> for each edge $v \rightarrow w$ if <i>status(w) = NEW</i> PROCESSPOSTORDERDFS(w) else if <i>status(w) = ACTIVE</i> fail gracefully <i>status(v) ← DONE</i> <i>PROCESS(v)</i>
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If known DAG

<u>PROCESSDAGPOSTORDER(G):</u> add vertex s for all vertices $v \neq s$ add edge $s \rightarrow v$ unmark v PROCESSDAGPOSTORDERDFS(s)	<u>PROCESSDAGPOSTORDERDFS(v):</u> mark v for each edge $v \rightarrow w$ if w is unmarked PROCESSDAGPOSTORDERDFS(w) PROCESS(v)
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Longest path  $O(|V| + |E|)$  (on DAG)

<u>LONGESTPATH(s, t):</u> for each node v in reverse topological order if $v = t$ <i>v.LLP ← ∞</i> else <i>v.LLP ← ∞</i> for each edge $v \rightarrow w$ <i>v.LLP ← max{v.LLP, <math>\ell(v \rightarrow w) + w.LLP</math>}</i> return s.LLP
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SCC (the vertex DONE in DFS is a source component of scc(G))  $O(|V| + |E|)$

<u>KOSARAJUSHARIR(G):</u> ((Phase 1: Push in DFS finishing order)) unmark all vertices for all vertices v if v is unmarked RevPushDFS(v) ((Phase 2: WFS in stack order)) unmark all vertices <i>count ← 0</i> while the stack is non-empty <i>v ← Pop</i> if v is unmarked <i>count ← count + 1</i> LABELONEWFS(v, count)	<u>REVPUSHDFS(v):</u> mark v for each edge $v \rightarrow u$ <i>in rev(G)</i> if u is unmarked RevPushDFS(u) <i>PUSH(v)</i>
<u>LABELONEWFS(v, count):</u> put v into the bag while the bag is not empty take v from the bag mark v <i>label(v) ← count</i> for each edge $v \rightarrow w$ <i>in G</i> if w is unmarked put w into the bag	
Single source shortest path (SSSP)	
<u>INITSSSP(s):</u> <i>dist(s) ← 0</i> <i>pred(s) ← NULL</i> for all vertices $v \neq s$ <i>dist(v) ← ∞</i> <i>pred(v) ← NULL</i>	<u>GENERICSSSP(s):</u> INITSSSP(s) put s in the bag while the bag is not empty take u from the bag for all edges $u \rightarrow v$ if $u \rightarrow v$ is tense RELAX( $u \rightarrow v$ ) put v in the bag
Dijkstra's: using priority heap: $O( E  \log V )$ , Fibonacci heap $O( E  +  V  \log V )$ (but no negative edge)	
Shimbel-Bellman-Ford $O( V  E )$	
<u>SHIMBELSSSP(s)</u> INITSSSP(s) repeat V times: for every edge $u \rightarrow v$ if $u \rightarrow v$ is tense RELAX( $u \rightarrow v$ ) for every edge $u \rightarrow v$ if $u \rightarrow v$ is tense return "Negative cycle!"	
All pair shortest path: Floyd-Warshall $O( V ^3)$	
<u>FLOYDWARSHALL2(V, E, w):</u> for all vertices u for all vertices v <i>dist[u, v] ← w(u→v)</i> for all vertices r for all vertices u for all vertices v if $dist[u, v] > dist[u, r] + dist[r, v]$ <i>dist[u, v] ← dist[u, r] + dist[r, v]</i>	

- P is the set of decision problems that can be solved in polynomial time
- NP is the set of decision problems with the following property: If the answer is Yes, then there is a proof of this fact that can be checked in polynomial time

- co-NP is essentially the opposite of NP. If the answer to a problem in co-NP is No, then there is a proof of this fact that can be checked in polynomial time.
- Every decision problem in P is also in NP and co-NP
- $\Pi$  is NP-hard  $\Leftrightarrow$  If  $\Pi$  can be solved in polynomial time, then  $P=NP$
- a problem is NP-complete if it is both NP-hard and an element of NP
- any algorithm that runs on a random-access machine in  $T(n)$  time can be simulated by a single-tape, single-track, single-head Turing machine that runs in  $O(T(n)^4)$  time
- To prove X is NP-hard

1. Pick a known NP-hard problem Y
2. Assume for the sake of argument, a polynomial time algorithm for X
3. Derive a polynomial time algorithm for Y, using algorithm X as subroutine
4. Contradiction

- A clique is another name for a complete graph, that is, a graph where every pair of vertices is connected by an edge
- A vertex cover of a graph is a set of vertices that touches every edge in the graph.
- A Hamiltonian cycle in a graph is a cycle that visits every vertex exactly once
- definition of several languages

- The *accepting* language  $ACCEPT(M) := \{w \in \Sigma^* \mid M \text{ accepts } w\}$
- The *rejecting* language  $REJECT(M) := \{w \in \Sigma^* \mid M \text{ rejects } w\}$
- The *halting* language  $HALT(M) := ACCEPT(M) \cup REJECT(M)$
- The *diverging* language  $DIVERGE(M) := \Sigma^* \setminus HALT(M)$
- M accepts L:  $ACCEPT(M) = L$
- M decides L:  $ACCEPT(M) = L$  and  $DIVERGE(M) = \emptyset$

- Useful properties

<p><b>Lemma 1.</b> <i>Let <math>M</math> be an arbitrary Turing machine.</i></p> <p>(a) <i>There is a Turing machine <math>M^R</math> such that <math>ACCEPT(M^R) = REJECT(M)</math> and <math>REJECT(M^R) = ACCEPT(M)</math>.</i></p> <p>(b) <i>There is a Turing machine <math>M^A</math> such that <math>ACCEPT(M^A) = ACCEPT(M)</math> and <math>REJECT(M^A) = \emptyset</math>.</i></p> <p>(c) <i>There is a Turing machine <math>M^H</math> such that <math>ACCEPT(M^H) = HALT(M)</math> and <math>REJECT(M^H) = \emptyset</math>.</i></p>
<p><b>Lemma 2.</b> <i>If <math>L</math> and <math>L'</math> are decidable, then <math>L \cup L'</math>, <math>L \cap L'</math>, <math>L \setminus L'</math>, and <math>L' \setminus L</math> are also decidable.</i></p>
<p><b>Corollary 3.</b> <i>The following hold for all languages <math>L</math> and <math>L'</math>.</i></p> <p>(a) <i>If <math>L \cap L'</math> is undecidable and <math>L'</math> is decidable, then <math>L</math> is undecidable.</i></p> <p>(b) <i>If <math>L \cup L'</math> is undecidable and <math>L'</math> is decidable, then <math>L</math> is undecidable.</i></p> <p>(c) <i>If <math>L \setminus L'</math> is undecidable and <math>L'</math> is decidable, then <math>L</math> is undecidable.</i></p> <p>(d) <i>If <math>L' \setminus L</math> is undecidable and <math>L'</math> is decidable, then <math>L</math> is undecidable.</i></p>
<p><b>Lemma 4.</b> <i>For all acceptable languages <math>L</math> and <math>L'</math>, the languages <math>L \cup L'</math> and <math>L \cap L'</math> are also acceptable.</i></p>
<p><b>Lemma 5.</b> <i>An acceptable language <math>L</math> is decidable if and only if <math>\Sigma^* \setminus L</math> is also acceptable.</i></p>

- Nature properties of encoding Turing machines: unique, modifiable, executable
- To prove that a language L is undecidable, reduce a known undecidable language to L (see example below)

**Theorem 12.** *HALT is undecidable.*

**Proof:** Suppose to the contrary that there is a Turing machine  $H$  that decides HALT. Then we can use  $H$  to build another Turing machine  $SH$  that decides the language SELFHALT. Given any string  $w$ , the machine  $SH$  first verifies that  $w = \langle M \rangle$  for some Turing machine  $M$  (rejecting if not), then writes the string  $ww = \langle M, M \rangle$  onto the tape, and finally passes control to  $H$ . But SELFHALT is undecidable, so no such machine  $SH$  exists. We conclude that  $H$  does not exist either.  $\square$

- Rice's theorem

**Rice's Theorem.** *Let  $\mathcal{L}$  be any set of languages that satisfies the following conditions:*

- *There is a Turing machine  $Y$  such that  $ACCEPT(Y) \in \mathcal{L}$ .*
- *There is a Turing machine  $N$  such that  $ACCEPT(N) \notin \mathcal{L}$ .*

*The language  $ACCEPTIN(\mathcal{L}) := \{\langle M \rangle \mid ACCEPT(M) \in \mathcal{L}\}$  is undecidable.*

- The set L in the statement of Rice's Theorem is often called a property of languages
- NP-rubric

<p><b>Rubric (for all undecidability proofs, out of 10 points):</b></p> <p><b>Diagonalization:</b></p> <ul style="list-style-type: none"> <li>+ 4 for correct wrapper Turing machine</li> <li>+ 6 for self-contradiction proof (= 3 for <math>\Leftarrow</math> + 3 for <math>\Rightarrow</math>)</li> </ul> <p><b>Reduction:</b></p> <ul style="list-style-type: none"> <li>+ 4 for correct reduction</li> <li>+ 3 for "if" proof</li> <li>+ 3 for "only if" proof</li> </ul> <p><b>Rice's Theorem:</b></p> <ul style="list-style-type: none"> <li>+ 4 for positive Turing machine</li> <li>+ 4 for negative Turing machine</li> <li>+ 2 for other details (including using the correct variant of Rice's Theorem)</li> </ul>
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