Lecture 8

NP-hardness of Skolem and undecidability for \min , + weighted automata

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Proof.

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Let p_1, \ldots, p_s be the first s prime numbers

For every $j \in \{1, ..., s\}$ we define

$$u_n^j = \begin{cases} 0 & \text{for } 1 \leqslant n < p_j \\ 1 & \text{for } n = p_j \\ u_{n-p_i}^i & \text{for } n > p_j \end{cases}$$

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For every i_l , where $i \in \{1, 2, 3\}$ let

$$y^{i_l} = \begin{cases} 1 - u^k & \text{if } v_{i_l} = x_k \text{ for some } k \in \{1, \dots, s\} \\ u^k & \text{if } v_{i_l} = \neg x_k \text{ for some } k \in \{1, \dots, s\} \end{cases}$$

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Define the sequences $y^i = y^{i_1}y^{i_2}y^{i_3}$ for all $i \in \{1, ..., m\}$

And
$$y = y^1 + \ldots + y^m$$

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Let $f: \mathbb{N} \to \{0,1\}^s$ defined as

$$f(n)=(a_1,\ldots,a_s)$$

where $a_i = 1 \iff p_i | n$

$$f(n) = (a_1, \ldots, a_s)$$
 is an evaluation of x_1, \ldots, x_s

Fact

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 iff $f(n)$ satisfies C_i

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Theorem

 φ is satisfiable iff there is n s.t. $y_n = 0$.

Weighted automata

Decision problems:

Containment: Given \mathcal{A} and \mathcal{B} does $\mathcal{A}(w) \leq \mathcal{B}(w)$ hold for all w

Equivalence: Given \mathcal{A} and \mathcal{B} does $\mathcal{A}(w) = \mathcal{B}(w)$ hold for all w

Boundedness: Given \mathcal{A} and c does $\mathcal{A}(w) \leq c$ hold for all w

(given \mathcal{A} and c is there a word w s.t. $\mathcal{A}(w) > c$)

Boundedness (2): Given A and c is there a word w s.t. A(w) = c?

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- These definitions make sense if ≤ makes sense in the semiring
- Decidability of containment \implies decidability of boundedness: define $\mathcal{B}(w) = c$ for all c.

Decision problems

• Over (min, +) containment and equivalence are interreducible

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• But over $(\mathbb{Q}, +, \cdot, 0, 1)$ containment is undecidable (because boundedness is undecidable)

While equivalence is decidable (possibly a proof in two weeks)

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Proof.

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Given \mathcal{M} is there a halting run ending with 0 in the counters?

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• \mathcal{M} is a sequence of lines I_1, \ldots, I_n with commands

Possible commands for $c \in \{x, y\}$

$$INC(c)$$
, $DEC(c)$

GOTO
$$I_i$$
, IF $c = 0$ GOTO I_i ELSE GOTO I_j

HALT

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One can assume that counters can never drop below 0

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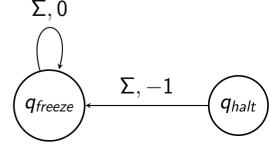
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 - If a "doesn't match" q_i then add a transition $(q_i, a, 0, q_{freeze})$
- ullet If *i*-th command is HALT and a=HALT then add $(q_i,a,1,q_{halt})$
 - Note that a correct run will have weight 1 and others will have weight 0

2., 3. Positive jump checker

One for each $c \in \{x, y\}$

The transitions are almost like before

On a fresh copy of q_1, \ldots, q_k

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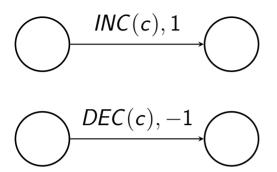
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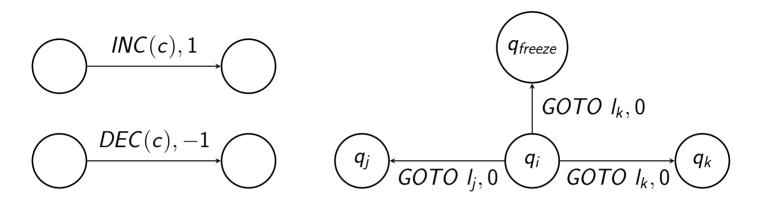
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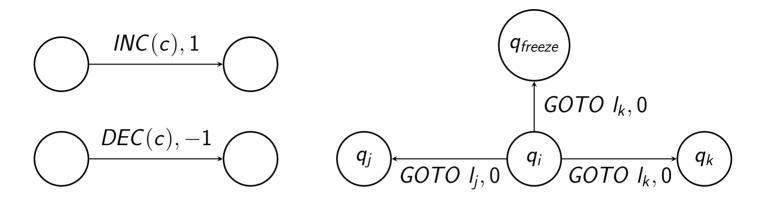
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• Positivity checks with *q*_{freeze}

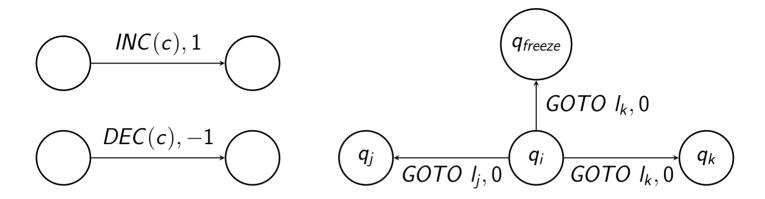




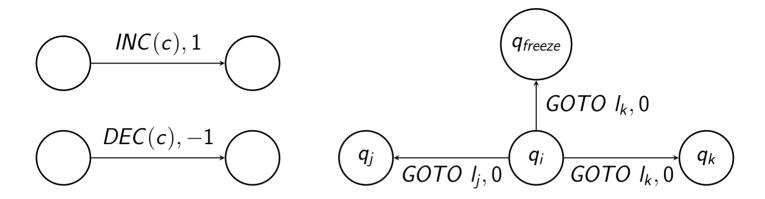


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If it's not positive then it will have value at most 0



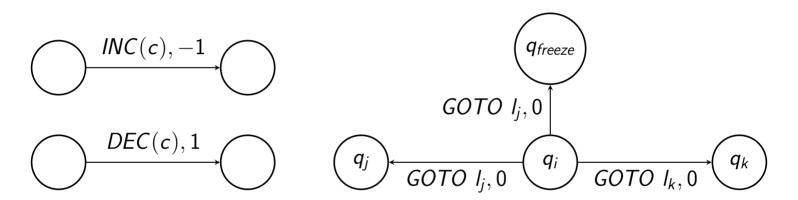
- If the counter is positive then the run in freeze will have positive value If it's not positive then it will have value at most 0
- If all $GOTO I_k$, 0 are correct then all runs in q_{freeze} have positive value If any is wrong then at least one has value at most 0



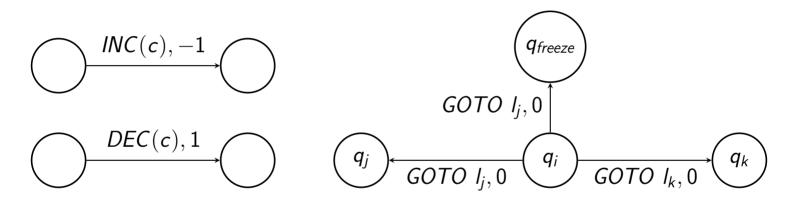
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- Since we take min of all values this is good

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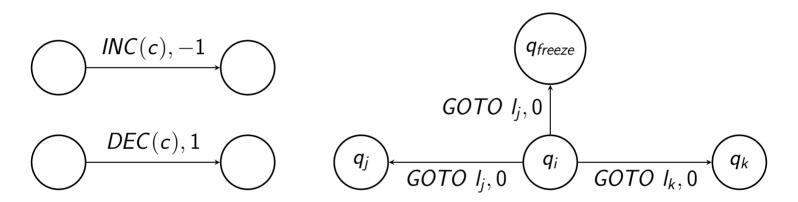


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- ullet When any zero test is wrong there is a run in q_{freeze} with value < 1

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And observe that $\mathcal{A} \leqslant \mathcal{B}$ iff $\mathcal{A}^{+c} \leqslant \mathcal{B}^{+c}$

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If there is such a w then $|w| \leq (c+1)^{|Q|}$

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Let $w = w_1 \dots w_n$ and let $M_i = M_{w_1} \dots M_{w_i}$

If $M_i^c = M_i^c$ then we can shorten the witness

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Given a finite automaton ${\cal A}$ just define a weighted automaton ${\cal B}$ With all transition weights 0 and inital/final weights 0

Then there exists a words w s.t. $\mathcal{B}(w) > 0$ iff $\mathcal{B}(w) = \infty$ So iff \mathcal{A} does not accept w

Concluding remarks

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Two rules of a thumb

• If something is undecidable then most often it is undecidable for linear ambiguous class $\text{Like boundedness for } (\mathbb{Z}_{+\infty}, \min, +, \infty, 0)$

• For finitely ambiguous usually problems become decidable