## Cook's Theorem

Papamakarios Theodoros

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## Reductions

## Definition

A polynomial reduction from a language $L_{1} \subseteq \Sigma_{1}^{*}$ to a language $L_{2} \subseteq \Sigma_{2}^{*}$ is a function $f: \Sigma_{1}^{*} \rightarrow \Sigma_{2}^{*}$ such that
(1) There is a polynomial time DTM program that computes $f$.
(2) For all $x \in \Sigma_{1}^{*}, x \in L_{1}^{*}$ if and only if $f(x) \in L_{2}^{*}$.

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Lemma
If $L_{1} \propto L_{2}$, then $L_{2} \in \mathcal{P} \Rightarrow L_{1} \in \mathcal{P}$.

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A language $L$ is defined to be $\mathcal{N} \mathcal{P}$-complete if $L \in \mathcal{N} \mathcal{P}$ and, for all other languages $L^{\prime} \in \mathcal{N} \mathcal{P}, L^{\prime} \propto L$.

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If $L$ is $\mathcal{N} \mathcal{P}$-complete, $L \in \mathcal{P} \Leftrightarrow \mathcal{P}=\mathcal{N} \mathcal{P}$.

## Lemma

If $L_{1}$ and $L_{2}$ belong to $\mathcal{N P}, L_{1}$ is $\mathcal{N P}$-complete, and $L_{1} \propto L_{2}$, then $L_{2}$ is $\mathcal{N} \mathcal{P}$-complete.

## SAT

## SATISFIABILITY

Instance: A set $X$ of variables and a collection $C$ of clauses over X (a CNF formula).
Question: Is there a satisfying truth assignment for C ?

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SAT $=\{\phi: \phi$ a propositional formula in CNF such that $\phi$ is satisfiable $\}$ Conclusions

An aside

## SAT

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C=\left\{x_{1} \vee \neg x_{2}, \neg x_{1} \vee x_{2}\right\}
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C^{\prime}=\left\{x_{1} \vee x_{2}, x_{1} \vee \neg x_{2}, \neg x_{1} \vee x_{2}, \neg x_{1} \vee \neg x_{2}\right\}
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Unsatisfiable: No satisfying truth assignment.

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## SAT

- We wish to show that $S A T$ is $\mathcal{N} \mathcal{P}$-complete,
- i.e., for all $L \in \mathcal{N} \mathcal{P}, L$ is reduced in polynomial time to $S A T$.
- SAT was the "first" $\mathcal{N} \mathcal{P}$-complete problem.
- But why SAT ...?


## Cook



| Abroce in i Arnad |  |
| :---: | :---: |
| Prou-diany The The conplexity of Theoren-Proving Procedures |  |
| A.CM Sympo , ing Stephen A. Cook |  |
| A.CM Sympore Uni | University of Taranto |
| Sumary | cortain recurstive sot of sty |
| It is shown that any recognition | 隹 in the problen of findiaf, a good |
| probleen solved by a polynonial time- | - lover bound on its popsib1e recog. |
| hounded nondeterminist ic Tur ing | nition tines Ne provide no such |
| blem of deteraining *hether a siven | give eridence that (tautologies) is |
| propositional fornila is a tautalogy. | . adifficult set to recognize. since |
| Here "reduced" neans, roughly speak- | many apparently difelcuit problens |
| ing, that the first problen can be | cas be reduced to deternining tau- |
| solved deterministically in polyno- | tologyhood. by reduced we mean, |
| mial time provided an oracle is | speaking, that if that 0 - |
| avaluable for soovirg the second. | logylood could be decided instantiy |
| From thas notion of reducibile, ${ }^{\text {poly }}$ | - coud be decided in polynomial cine. |
| defined, and it is shown that the | In order to nake this notion precise. |
| problen of deternining tautologyhood | do introduce query nachines, which |
| has the sane polynonial degree as the | are like Juring nachines with oracles |
| probien of deternining whether the first of two given graphs is iso- | in [1]. |
| rpheic to a subgraph of the second. | - ${ }^{2}$ query machine is a moltitape |
| Other examples are discussed. ${ }_{\text {a }}{ }^{\text {a }}$, | Turing nachine with a distingutshed tape called the query tape, and |
| method of neasur ing the complexity of | (tape called the query tape and |
| calculus is introduced and discussed. | 1. the query state, yes state, amd no |
|  | state, respectively; if ${ }^{M}$ is a |
| strings neans a set of strings on. | - strinss. then a T-congutation of |

## The Theorem

## Proposition <br> $S A T \in \mathcal{N} \mathcal{P}$.

Proof.
Trivial.

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## Proposition

For every $L \in \mathcal{N P}, L \propto S A T$.
Proof: Non trivial.

## The Theorem

Let $L \in \mathcal{N P}$ and $M$ a polynomial time NDTM which decides the language $L$. Let $p(n)$ be a polynomial that bounds the time complexity function $T_{M}(n)$.

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Suppose that M's set of states is

$$
Q=\left\{q_{0}=q_{\text {start }}, q_{1}=q_{y e s}, q_{2}=q_{n o}, \ldots, q_{r}\right\}
$$

and M's alphabet is

$$
\Gamma=\left\{s_{0}=\sqcup, s_{1}, \ldots, s_{v}\right\}
$$

## The Theorem

Assume that the certificate is written in cells -1 to $-p(n)$ and the input $x$ is written in cells 1 to $|x|$. Cell 0 always contains by convention the blank symbol $\sqcup$.


The computation is specified completely by giving the contents of these squares, the current state and the position of the head at each time 0 to $p(n)$.

## Variables

$\phi$ 's variables will be

## Variable

## Range

## Intended Meaning

$$
\begin{array}{ccc}
Q[i, k] & 0 \leq i \leq p(n) & \text { At time } i M \text { is in state } q_{k} . \\
& 0 \leq k \leq r & \\
H[i, j] & 0 \leq i \leq p(n) & \text { At time } i M \text { 's head } \\
& -p(n) \leq j \leq p(n)+1 & \text { is scanning cell } j . \\
& 0 \leq i \leq p(n) & \\
S[i, j, k] & -p(n) \leq j \leq p(n)+1 & \text { At time } i M \text { 's } j \text { 's cell } \\
& 0 \leq k \leq v & \text { contains symbol } s_{k} .
\end{array}
$$

## Clauses

## Group 1

$$
\begin{array}{ll}
\{Q[i, 0] \vee Q[i, 1] \vee \cdots \vee Q[i, r]\}, & 0 \leq i \leq p(n) \\
\left\{\neg Q[i, j] \vee \neg Q\left[i, j^{\prime}\right]\right\}, & 0 \leq i \leq p(n), \\
\equiv\left\{\neg\left(Q[i, j] \wedge Q\left[i, j^{\prime}\right]\right)\right\} &
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The machine must be at exactly one state at each time. We suppose that if $M$ accepts before time $p(n)$, then it remains at this configuration until time $p(n)$.

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$\mathcal{O}(p(n))$ such clauses.

## Clauses

Group $2 \mathcal{O}\left(p^{3}(n)\right)$ clauses
$\{H[i,-p(n)] \vee \cdots \vee H[i, p(n)+1]\}, 0 \leq i \leq p(n)$
$\left\{\neg H[i, j] \vee \neg H\left[i, j^{\prime}\right]\right\}, \quad 0 \leq i \leq p(n),-p(n) \leq j<j^{\prime} \leq p(n)+1$

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Group $3 \mathcal{O}\left(p^{2}(n)\right)$ clauses
$\{S[i, j, 0] \vee \cdots \vee S[i, j, v]\}, \quad 0 \leq i \leq p(n), p(n) \leq j \leq p(n)+1$
$\left\{\neg S[i, j, k] \vee \neg S\left[i, j, k^{\prime}\right]\right\}, \quad 0 \leq i \leq p(n),-p(n) \leq j \leq p(n)+1$,
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$0 \leq k<k^{\prime} \leq v$
For each time, there must be exactly one symbol at each cell.

## Clauses

Group $4 \mathcal{O}(p(n))$ clauses

$$
\begin{aligned}
& \{Q[0,0]\},\{H[0,1]\},\{S[0,0,0]\}, \\
& \left\{S\left[0,1, k_{1}\right]\right\},\left\{S\left[0,2, k_{2}\right\}, \ldots,\left\{S\left[0, n, k_{n}\right]\right\}\right. \\
& \{S[0, n+1,0]\},\{S[0, n+2,0]\}, \ldots,\{S[0, p(n)+1,0]\}, \\
& \text { where } x=s_{k_{1}} s_{k_{2}} \ldots s_{k_{n}}
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At time 0 , the computation is in the initial configuration for input x.

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Group 5

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\{Q[p(n), 1]\}
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By time $p(n), M$ must enter state $q_{y e s}$ and hence accept $\times$.

## Clauses

Group $6 \mathcal{O}\left(p^{2}(n)\right)$ clauses
The first subgroup guarantees that if the head is not scanning tape square $j$ at time $i$, then the symbol in cell $j$ does not change between times $i$ and $i+1$.

$$
\begin{aligned}
\{\neg S[i, j, l] \vee H[i, j] \vee S[i+1, j, l]\}, & 0 \leq i<p(n) \\
\equiv\{(S[i, j, l] \wedge \neg H[i, j]) \Rightarrow S[i+1, j, l]\} & -p(n) \leq j \leq p(n)+1 \\
& 0 \leq I \leq v
\end{aligned}
$$

Group $6 \mathcal{O}\left(p^{2}(n)\right)$ clauses
The remaining subgroup guarantees that the changes from one configuration to the next are in accord with the transition function $\delta$ for $M$. For each quadruple ( $i, j, k, l$ ), $0 \leq i \leq p(n)$, $-p(n) \leq j \leq p(n)+1,0 \leq k \leq r$ and $0 \leq I \leq v$, this subgroup contains the following three clauses:

$$
\begin{aligned}
& \{\neg H[i, j] \vee \neg Q[i, k] \vee \neg S[i, j, I] \vee H[i+1, j+\Delta]\} \\
& \quad \equiv\{(H[i, j] \wedge Q[i, k] \wedge S[i, j, I]) \Rightarrow H[i+1, j+\Delta]\} \\
& \left\{\neg H[i, j] \vee \neg Q[i, k] \vee \neg S[i, j, I] \vee Q\left[i+1, k^{\prime}\right]\right\} \\
& \left\{\neg H[i, j] \vee \neg Q[i, k] \vee \neg S[i, j, I] \vee S\left[i+1, j, I^{\prime}\right]\right\}
\end{aligned}
$$

where if $q_{k} \in Q-\left\{q_{y e s}, q_{n o}\right\}$, then the values of $\Delta, k^{\prime}$ and $I^{\prime}$ are such that $\delta\left(q_{k}, s_{l}\right)=\left(q_{k^{\prime}}, s_{l^{\prime}}, \Delta\right)$ and if $q_{k} \in\left\{q_{y e s}, q_{n o}\right\}$, then $\Delta=-, k^{\prime}=k$ and $I^{\prime}=I$.

## Almost there

If $x \in L$, then there is a certificate for which M's computation on $x$ will accept after at most $p(n)$ steps, and this computation, given the interpretation of the variables, imposes a truth assignment that satisfies all the clauses in $C=G_{1} \cup G_{2} \cup G_{3} \cup G_{4} \cup G_{5} \cup G_{6}$.

Conversely, the construction of $C$ is such that any satisfying truth assignment for $C$ must correspond to an accepting computation of $M$ on $x$ for a certificate (the certificate constructed by the truth assignment).

Plus, the construction can be done in polynomial time.

## Aftermath



## Richard M. Karp

University of California at Berkeley

Abstract: A large class of computational problems involve the determination of properties of graphs, digraphs, integers, arrays elements of other countable domains. Through simple encodings from such domains into the set of words over a finite alphabet these problens can be converted into language recognition problens and we can inquire into their computational complexity. It is reasonable to consider such a problem satisfactorily solved when an algorithn for its solution is found which terminates within a number of steps bounded by a polynonial in the length of the input ing, matching, packing, routing, assignment and sequencing are equivalent, in the sense that either each of them possesses a polynonial-bounded algorithm or none of then does.

Cook's paper was published in 1971. In 1972 Karp showed in the above paper $21 \mathcal{N} \mathcal{P}$-complete problems. And so on...

## An aside: Satisfiability variants

## 3-SAT

Instance: A CNF formula $C$ such that every clause has three literals.
Question: Is there a satisfying truth assignment for $C$ ?
Proposition
3 - SAT is $\mathcal{N} \mathcal{P}$-complete.

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Instance: A CNF formula $C$ such that every clause has three literals.
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## Proposition

3 - SAT is $\mathcal{N} \mathcal{P}$-complete.
MON3-SAT
Instance: A CNF formula $C$ such that every clause has three variables all negated or all not negated.
Question: Is there a satisfying truth assignment for C?
Proposition
MON3 - SAT is $\mathcal{N P}$-complete.

## An aside: Satisfiability variants

## Proposition <br> 2 - SAT is $\mathcal{N} \mathcal{L}$-complete.

## An aside: Satisfiability variants

## Proposition

$2-S A T$ is $\mathcal{N} \mathcal{L}$-complete.

A Horn clause is a clause such that all variables in it are negated except (maybe) one. Many Horn clauses make up a Horn formula.

## HORN-SAT

Instance: A Horn formula C.
Question: Is there a satisfying truth assignment for $C$ ?

## Proposition

HORN - SAT is $\mathcal{P}$-complete.

