## COMPLEXITY THEORY

## Lecture 18: Questions and Answers

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TU Dresden, 20th Dec 2017

## The Power of Circuits

## Review

What we learned in the previous lecture:

- Circuits provide an alternative model of computation
- $P \subseteq P_{\text {/poly }}$
- Circuit-Sat is NP-complete

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Theorem 18.1: $\mathrm{P} /$ poly contains undecidable problems.

Proof: We define the unary Halting problem as the (undecidable) language:

$$
\begin{gathered}
\text { UHALT := }\left\{1^{n} \mid \text { the binary encoding of } n \text { encodes a pair }\langle\mathcal{M}, w\rangle\right. \\
\text { where } \mathcal{M} \text { is a TM that halts on word } w\}
\end{gathered}
$$

For a number $1^{n} \in \operatorname{UHALT}$, let $C_{n}$ be the circuit that computes a generalised AND of all inputs. For all other numbers, let $C_{n}$ be a circuit that always returns 0 . The circuit family $C_{1}, C_{2}, C_{3}, \ldots$ accepts UHalt.

## Uniform Circuit Families

$\mathrm{P}_{\text {/poly }}$ is too powerful, since we do not require the circuits to be computable.
We can add this requirement:
Definition 18.2: A circuit family $C_{1}, C_{2}, C_{3}, \ldots$ is log-space-uniform if there is a log-space computable function that maps words $1^{n}$ to (an encoding of) $C_{n}$.

Note: We could also define similar notions of uniformity for other complexity classes.

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Note: We could also define similar notions of uniformity for other complexity classes.
Theorem 18.3: The class of all languages that are accepted by a log-spaceuniform circuit family of polynomial size is exactly $P$.

Proof sketch: A detailed analysis shows that our earlier reduction of polytime DTMs to circuits is log-space-uniform. Conversely, a polynomial-time procedure can be obtained by first computing a suitable circuit (in log-space) and then evaluating it (in polynomial time).

## Turing Machines That Take Advice

One can also describe $\mathrm{P}_{\text {/poly }}$ using TMs that take "advice":
Definition 18.4: Consider a function $a: \mathbb{N} \rightarrow \mathbb{N}$. A language $\mathbf{L}$ is accepted by a Turing Machine $\mathcal{M}$ with $a$ bits of advice if there is a sequence of advice strings $\alpha_{0}, \alpha_{1}, \alpha_{2}, \ldots$ of length $\left|\alpha_{i}\right|=a(i)$ and $\mathcal{M}$ accepts inputs of the form ( $w \# \alpha_{|w|}$ ) if and only if $w \in \mathbf{L}$.
$\mathrm{P}_{/ \text {poly }}$ is equivalent to the class of problems that can be solved by a PTime TM that takes a polynomial amount of "advice" (where the advice can be a description of a suitable circuit).
(This is where the notation $\mathrm{P}_{\text {/poly }}$ comes from.)

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## Proof sketch (see Arora/Barak Theorem 6.19):

- if NP $\subseteq P$ poly then there is a polysize circuit family solving Sat
- Using this, one can argue that there is also a polysize circuit family that computes the lexicographically first satisfying assignment ( $k$ output bits for $k$ variables)
- A $\Pi_{2}$-QBF formula $\forall \vec{X} . \exists \vec{Y} . \varphi$ is true if, for all values of $\vec{X}, \varphi(\vec{X})$ is satisfiable.
- In $\Sigma_{2}^{P}$, we can: (1) guess the polysize circuit for SAT, (2) check for all values of $\vec{X}$ if its output is really a satisfying assignment (to verify the guess)
- This solves $\Pi_{2}^{P}$-hard problems in $\Sigma_{2}^{P}$
- But then the Polynomial Hierarchy collapses at $\Sigma_{2}^{\mathrm{P}}$, as claimed.


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See [Arora/Barak, Theorem 6.20] for a proof sketch.

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See [Arora/Barak, Theorem 6.20] for a proof sketch.

Corollary 18.7: If ExpTime $\subseteq P_{/ \text {poly }}$ then $P \neq N P$.
Proof: If ExpTime $\subseteq P /$ poly then ExpTime $=\Sigma_{2}^{p}$ (Meyer's Theorem).
By the Time Hierarchy Theorem, $\mathrm{P} \neq$ ExpTime, so $\mathrm{P} \neq \Sigma_{2}^{p}$.
So the Polynomial Hierarchy doesn't collapse completely, and $P \neq$ NP.

## How Big a Circuit Could We Need?

We should not be surprised that $\mathrm{P}_{\text {/poly }}$ is so powerful: exponential circuit families are already enough to accept any language

Exercise: show that every Boolean function over $n$ variables can be expressed by a circuit of size $\leq n 2^{n}$.

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It turns out that these exponential circuits are really needed:
Theorem 18.8 (Shannon 1949 (!)): For every $n$, there is a function $\{0,1\}^{n} \rightarrow$ $\{0,1\}$ that cannot be computed by any circuit of size $2^{n} /(10 n)$.

In fact, one can even show: almost every Boolean function requires circuits of size $>2^{n} /(10 n)$ - and is therefore not in $\mathrm{P}_{/ \text {poly }}$

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# Question 1: The Logarithmic Hierarchy 

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In detail, we can define:

- $\Sigma_{0}^{\mathrm{L}}=\Pi_{0}^{\mathrm{L}}=\mathrm{L}$
- $\Sigma_{i+1}^{\mathrm{L}}=\mathrm{NL}^{\Sigma_{i}^{\llcorner }} \quad$ alternatively: languages of log-space bounded $\Sigma_{i+1}$ ATMs
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Therefore $\Sigma_{i}^{\llcorner }=\Pi_{i}^{\llcorner }=\mathrm{NL}$ for all $i \geq 1$.

The Logarithmic Hierarchy collapses on the first level.

Historic note: In 1987, just before the Immerman-Szelepcsényi Theorem was published, Klaus-Jörn Lange, Birgit Jenner, and Bernd Kirsig showed that the Logarithmic Hierarchy collapses on the second level [ICALP 1987].

## Question 2: The Hardest Problems in $P$

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- But we do know that NP is at least as challenging as $P$, i.e., $P \subseteq N P$.


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Let's first recall the definitions:
Definition: A problem $\mathbf{L}$ is NP-hard if, for all problems $\mathbf{M} \in N P$, there is a polynomial many-one reduction $\mathbf{M} \leq_{m} \mathbf{L}$.

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Example 18.9: We know that $L \subseteq P \subseteq N P$ but we do not know if any of these subsumptions are proper. Suppose that the truth actually looks like this: $\mathrm{L} \subsetneq \mathrm{P}=$ NP. Then all non-trivial problems in P are NP-hard (why?), but not every problem would be P-hard (why?).

Note: This is really about the different notions of reduction used to define hardness. If we used log-space reductions for P-hardness and NP-hardness, the claim would follow.

## Question 3: Problems Harder than P

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Polynomial time is an approximation of "practically tractable" problems:

- Many practical problems are in $P$, including many very simple ones (e.g., Ø)
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- However, there are even harder problems that are no longer in $P$


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These concrete examples both are hard for P:

- The Word Problem for polynomially time-bounded DTMs is hard for $P$
- This polytime Word Problem log-space reduces to the Word Problem for exponential TMs (reduction: the identity function)
- It also log-space reduces to the Halting problem: a reduction merely has to modify the TM so that every rejecting halting configuration leads into an infinite loop


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So, it's clear what we have to do now ...

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Schöning to the rescue (see Theorem 15.2):
Corollary 18.10: Consider the classes $\mathrm{C}_{1}=$ ExpPHard (P-hard problems in ExpTime) and $\mathrm{C}_{2}=\mathrm{P}$. Both are classes of decidable languages. We find that for either class $\mathrm{C}_{k}$ :

- We can effectively enumerate $\operatorname{TMs} \mathcal{M}_{0}^{k}, \mathcal{M}_{1}^{k}, \ldots$ such that $\left.\mathrm{C}_{k}=\left\{\mathbf{L}\left(\mathcal{M}_{i}^{k}\right) \mid i \geq 0\right)\right\}$.
- If $\mathbf{L} \in \mathbf{C}_{k}$ and $\mathbf{\mathbf { L } ^ { \prime }}$ differs from $\mathbf{L}$ on only a finite number of words, then $\mathbf{L}^{\prime} \in \mathbf{C}_{k}$

Let $\mathbf{L}_{\mathbf{1}}=\emptyset$, and let $\mathbf{L}_{\mathbf{2}}$ be some ExpTime-complete problem. Clearly, $\mathbf{L}_{\mathbf{1}} \notin$ ExpPHard and $\mathbf{L}_{\mathbf{2}} \notin \mathrm{P}$ (Time Hierarchy), hence there is a decidable language $\mathrm{L}_{\mathrm{d}} \notin$ ExpPHard $\cup \mathrm{P}$.
Moreover, as $\emptyset \in \mathrm{P}$ and $\mathbf{L}_{\mathbf{2}}$ is not trivial, $\mathbf{L}_{\mathbf{d}} \leq_{p} \mathbf{L}_{\mathbf{2}}$ and hence $\mathbf{L}_{\mathbf{d}} \in$ ExpTime. Therefore $\mathbf{L}_{\mathbf{d}} \notin$ ExpPHard implies that $\mathbf{L}_{\mathbf{d}}$ is not P-hard.

## Q3: Are problems harder than P also hard for P ?

No, there are problems in ExpTime that are neither in P nor hard for P .
(Other arguments can even show the existence of undecidable sets that are not P -hard ${ }^{1}$ )

[^0]
## Q3: Are problems harder than P also hard for P ?

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(Other arguments can even show the existence of undecidable sets that are not P -hard ${ }^{1}$ )

## Discussion:

- Considering Questions 2 and 3, the use of the word hard is misleading, since we interpret it as difficult
- However, the actual meaning difficult would be "not in a given class" (e.g., problems not in P are clearly more difficult than those in P )
- Our formal notion of hard also implies that a problem is difficult in some sense, but it also requires it to be universal in the sense that many other problems can be solved through it
What we have seen is that there are difficult problems that are not universal.

[^1]
## Your Questions

## Summary and Outlook

Nonuniform circuit families are very powerful, and even polynomial circuits can solve undecidable problems

Log-space-uniform polynomial circuits capture P .
Most boolean functions cannot be expressed by polynomial circuits, yet we don't know of any such function that is even in NExp

Answer 1: The Logarithmic Hierarchy collapses.
Answer 2: We don't know that NP-hard implies P-hard.
Answer 3: Being outside of P does not make a problem P -hard.
What's next?

- Holidays
- More on circuits
- Randomness


[^0]:    ${ }^{1}$ Related note: the undecidable UHALt is not NP-hard, since it is a so-called sparse language.

[^1]:    ${ }^{1}$ Related note: the undecidable UHALT is not NP-hard, since it is a so-called sparse language.

