# Complexity Theory 

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## Lecture 3

## Basic Complexity Classes

## Agenda

- decision vs. search
- basic complexity classes
- time and space
- deterministic and non-deterministic
- sample problems


## Decision vs. Search

- often one is interested in functions $f:\{0,1\}^{*} \rightarrow\{0,1\}$
- $f$ can be identified with the language $L_{f}=\left\{x \in\{0,1\}^{*} \mid f(x)=1\right\}$
- TM that computes $f$ is said to decide $L_{f}$ (and vice versa)


## Example (Indset)

Consider the independent set problem.
Search What is the largest independent set of a graph?
Decision Indset $=\{\langle G, k\rangle \mid G$ has independent set of size $k\}$

Often decision plus binary search can solve search problems.

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- decision vs. search $\checkmark$
- basic complexity classes
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## Time complexity

## Definition (DTIME)

Let $T: \mathbb{N} \rightarrow \mathbb{N}$ be a function. $L \subseteq\{0,1\}^{*}$ is in $\operatorname{DTIME}(T)$ if there exists a TM deciding $L$ in time $T^{\prime}$ for $T^{\prime} \in O(T)$.

- D refers to deterministic
- constants are ignored since TM can be sped up by arbitrary constants


## Space complexity

## Definition (SPACE)

Let $S: \mathbb{N} \rightarrow \mathbb{N}$ and $L \subseteq\{0,1\}^{*}$. Define $L \in \operatorname{SPACE}(S)$ iff

- there exists a TM $M$ deciding $L$
- no more than $S^{\prime}(n)$ locations on $M$ 's work tapes ever visited during computations on every input of length $n$ for $S^{\prime} \in O(S)$


## Remarks

- more detailed definition (cf. exercises): count non-a symbols, where $\square$ must not be written
- constants do not matter
- as for time complexity, require space-constructible bounds
- $S$ is space-constructible: there is TM $M$ computing $S(|x|)$ in $O(S(|x|))$ space on input $x$
- TM knows its bounds
- work tape restrictions: allows to store input
- space bounds < $n$ make sense (as opposed to time)
- require space $\log n$ to remember positions in input


## Non-deterministic TMs

## Definition (NDTM)

A non-deterministic TM (NDTM) is a triple ( $\Gamma, Q, \delta$ ) like a deterministic TM except

- $Q$ contains a distinguished state $q_{\text {accept }}$
- $\delta$ is a pair $\left(\delta_{0}, \delta_{1}\right)$ of transition functions
- in each step, NDTM non-deterministically chooses to apply either $\delta_{0}$ or $\delta_{1}$
- NDTM $M$ accepts $x, M(x)=1$ if there exists a sequence of choices s.t. $M$ reaches $q_{\text {accept }}$
- $M(x)=0$ if every sequence of choices makes $M$ halt without reaching $q_{\text {accept }}$


## On non-determinism

- not supposed to model realistic devices
- remember impact of non-determinism finite state machines, pushdown automata
- NDTM compute the same functions as DTM (why?)
- non-determinism ~ guessing

Non-deterministic complexity Define NTIME $(T)$ and $\operatorname{NSPACE}(S)$ such that $T$ and $S$ are bounds regardless of non-deterministic choices.

## Basic complexity classes



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## Interesting examples

Most examples are the hardest within a given complexity class. They are complete for the class (wrt suitable reductions).

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L: essentially constant number of pointers into input plus logarithmically many boolean flags

- UPath $=\{\langle G, s, t\rangle \mid \exists$ a path from $s$ to $t$ in undirected graph $G\}$ [Reingold 2004]
- Even $=\{x \mid x$ has an even number of 1 s$\}$


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NL: L plus guessing, read-once certificates

- Path $=\{\langle G, s, t\rangle \mid \exists$ a path from $s$ to $t$ in directed graph $G\}$
- 2SAT $=\{\varphi \mid$
$\varphi$ satisfiable Boolean formula in CNF with two literals per clause \}


## Interesting examples

P: polynomial time, tractable, low-level choices of TM definitions are immaterial to P

- Circuit - Eval $=\{\langle C, x\rangle \mid C$ is a $n-$ in/1-out circuit, $x$ satisfying signals $\}$
- Primes $=\{x \mid x$ prime $\}$
[AKS 2004]
- many graph problems like DFS and BFS


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NP: polynomially verifiable certificates, puzzles

- Indset $=\{\langle G, k\rangle \mid G$ has an independent set of size $k\}$
- 3-Coloring $=\{G \mid G$ is 3-colorable $\}$
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PSPACE: polynomial space, games, for instance
TQBF $=\left\{Q_{1} x_{1} \ldots Q_{k} x_{k} \varphi \mid k \geq 0, Q_{i} \in\{\forall, \exists\}, \varphi\right.$ Boolean formula over $x_{i}$ such that whole formula is true \}


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EXP: exponential-time, for instance the language Halt ${ }_{k}=\{\langle M, x, k\rangle \mid$ DTM $M$ stops on input $x$ within $k$ steps $\}$


## Complements

## Definition (Complement classes)

Let $C \subseteq \mathcal{P}\left(\{0,1\}^{*}\right)$ be a complexity class. We define $\operatorname{coC}=\{\bar{L} \mid L \in C\}$ to be the complement class of $C$, where $\bar{L}=\{0,1\}^{*} \backslash L$ is the complement of L.

- important class coNP
- coNP is not the complement of NP
- example: Tautology $\in$ coNP, where a tautology is Boolean formula that is true for every assignment
- reminder: closure under complement wrt expressiveness and conciseness
- finite state machines
- pushdown automata
- DTM, NDTM
- note: $\mathrm{P} \subseteq \mathrm{NP} \cap \operatorname{coNP}$


## Agenda

- universal Turing machine $\checkmark$
- decision vs. search $\checkmark$
- computability, halting problem $\checkmark$
- basic complexity classes $\checkmark$


## Relation between classes



## Teaser

A regular expression over $\{0,1\}$ is defined by

$$
r::=0|1| r r|r| r \mid r^{*}
$$

The language defined by $r$ is written $\mathcal{L}(r)$.

What is the computational complexity of

- deciding whether two regular expressions are equivalent, that is $\mathcal{L}\left(r_{1}\right)=\mathcal{L}\left(r_{2}\right)$ ?
- deciding whether a regular expression is universal, that is $\mathcal{L}(r)=\{0,1\}^{*}$ ?
- deciding the same for star-free regular expressions?


## What have we learnt?

- TM can be represented as strings; universal TM can simulate any TM given its representations with polynomial overhead only
- uncomputable functions do exist (halting problem): diagonalization and reductions
- non-deterministic TMs
- space, time, deterministic, non-deterministic, complement complexity classes
- L, NL, P, NP, EXP, PSPACE
- 2SAT, 3SAT, Path, UPath, TQBF, Primes, Indset, 3-Coloring
- big picture
- up next: justify and explore the big picture

