

1 Complexity Classes

Unless explicitly stated, by a TM we will mean a *multi-tape* TM. When we talk about the space used by a multi-tape TM, we only count the number of cells on the worktape(s) that are touched by the TM during its computation. That is, we *do not* count the input tape or the output tape.

Below n will denote the input size.

For some function $f : \mathbb{N} \rightarrow \mathbb{N}$,

- $\text{Time}(f(n)) = \{L \mid L \text{ is decided by some TM in at most } f(n) \text{ steps}\}$
- $\text{Space}(f(n)) = \{L \mid L \text{ is decided by some TM that touches at most } f(n) \text{ cells of its worktapes}\}$

For example,

- $P = \cup_{k \geq 1} \text{Time}(n^k)$,
- $\text{EXP} = \cup_{k \geq 1} \text{Time}(2^{n^k})$,
- $L = \text{Space}(\log n)$,
- $\text{PSPACE} = \cup_{k \geq 1} \text{Space}(n^k)$.

In general, a complexity class is a collection of languages decidable within a given amount of computational resources.

The relationship between these classes is as follows:

$$L \subseteq P \subseteq \text{PSPACE} \subseteq \text{EXP}$$

We will show in the next lecture how to simulate space by time and vice versa. Note that although all these inclusions are not strict (e.g., it is not impossible that $P = L$ or that $P = \text{PSPACE}$, albeit unlikely), we can show that $L \subsetneq \text{PSPACE}$ and $P \subsetneq \text{EXP}$. The general form of a result like this is called the hierarchy theorems (for space and time, in this case).

2 Hierarchy Theorems

First we recall a basic result from Computability Theory that there are undecidable languages. This can be argued as follows. There is a 1-1 correspondence between algorithms (TMs) and natural numbers. There is a 1-1 correspondence between languages (over the binary alphabet) and real numbers (in the interval $[0, 1]$). Since the set of reals is bigger

¹This lecture is a modification of notes by Valentine Kabanets

than the set of natural numbers (as argued by Cantor a couple of hundred years ago), we have the existence of an undecidable language.

The problem with the argument above is its non-constructiveness. We haven't exhibited a particular example of a language that is not decidable. Turing was the first to give such examples. The most famous is his Halting Problem.

Recall $Halt = \{(M, x) \mid \text{TM } M \text{ halts on } x\}$. (This is a version of the Halting Problem. A different definition considers $Halt = \{M \mid \text{TM } M \text{ halts on blank tape}\}$)

Theorem 1. *Halt is undecidable.*

We will prove the theorem in two stages. First, we define a certain language $Diag$ and show that $Diag$ is undecidable. Then we will show that $Diag$ is reducible to $Halt$, and hence, $Halt$ is also undecidable. (Note the use of a reduction to prove a lower bound on the complexity of $Halt$.)

To define $Diag$, we consider an enumeration x_1, x_2, x_3, \dots of all binary strings. Let M_1, M_2, M_3, \dots be an enumeration of all Turing machines whose descriptions are x_1, x_2, x_3, \dots . (Note some binary strings correspond to "broken" TMs. We will assume that a broken TM does not accept any string.) We define $Diag$ as follows:

$$Diag = \{M \mid M \text{ does not accept input } M\}.$$

Lemma 2 (Turing). *Diag is undecidable.*

Proof. Our proof is by contradiction. Suppose some TM D decides $Diag$. Then we have one of two cases:

1. D accepts D , OR
2. D does not accept D .

In the first case, we get $D \notin Diag$ (by definition of $Diag$). Since D decides $Diag$ (by our assumption), D does not accept D . A contradiction.

In the second case, we get $D \in Diag$ (by definition of $Diag$). Since D decides $Diag$ (by our assumption), D accepts D . Again a contradiction.

Thus, our assumption that $Diag$ is decidable must be wrong. \square

Proof of Theorem 1. Now we reduce $Diag$ to $Halt$. If $Halt$ were decidable by some TM H , then we could decide $Diag$ as follows:

"On input M , run the TM H on (M, M) , and negate the output (i.e., Accept if H rejects, and Reject if H accepts)."

It is easy to see that the described algorithm decides $Diag$. But, by our Lemma 2, $Diag$ is undecidable. Hence, so is $Halt$. \square

The proof of Theorem 1 uses two very important techniques:

- simulation, and
- diagonalization.

The same ideas are used to prove *Hierarchy Theorems*: with more time (space), one can compute more languages.

In this course, we will always use *proper* complexity functions $f(n)$. A function $f(n)$ is called *proper* if there is a TM M that, on input 1^n , outputs exactly $f(n)$ symbols and runs in time $O(f(n) + n)$ and space $O(f(n))$. The usual functions like $\log n$, \sqrt{n} , n^2 , 2^n , $n!$ are proper. Also, if f and g are proper, then so are $f + g$, fg , $f(g)$, f^g , 2^g .

Lemma 3. *Let $f(n)$ be any proper complexity function. The language*

$$\text{Halt}_f = \{(M, x) \mid \text{TM } M \text{ accepts } x \text{ in at most } f(|x|) \text{ steps}\}$$

is decidable in time $g(n) = (f(n))^3$.

Proof. We can construct a universal TM H with 3 tapes that does the following. Given an input (M, x) , our TM H converts a (possibly multi-tape) TM M to an equivalent one-tape TM M' . If M accepts x in at most $f(|x|)$ steps, then the new TM M' will accept x in at most $(f(|x|))^2$ steps.

Next, H will simulate M' on x for at most $(f(|x|))^2$ steps. Each step of M' can be simulated by H in at most $|M'|$ steps (i.e., the size of the description of the TM M' , which is some constant dependent on M'); this constant is at most $f(|x|)$. Thus, our entire simulation will take at most $(f(|x|))^3$ steps. (Note that we needed $f(n)$ to be a proper function in order to be able to simulate M for at most $f(n)$ steps!) \square

Consider the language

$$\text{Diag}_f = \{M \mid \text{TM } M \text{ does not accept input } M \text{ in at most } f(|M|) \text{ steps}\}$$

By Lemma 3, the language Diag_f is in $\text{Time}(g(2n))$.

Theorem 4. *Diag_f is not in $\text{Time}(f(n))$.*

Proof. The proof is virtually the same as the one showing that the language Diag (defined earlier) is undecidable. The details are left as an exercise. \square

Hence, we have

Theorem 5 (Time Hierarchy). *For every proper complexity function $f(n) \geq n$,*

$$\text{Time}(f(n)) \subsetneq \text{Time}((f(2n))^3).$$

Note that the version in Sipser's book is a stronger result:

$$\text{Time}(f(n)/\log n) \subsetneq \text{Time}(f(n))$$

Similarly, we can prove

Theorem 6 (Space Hierarchy). *For every proper complexity function $f(n) \geq \log n$,*

$$\text{Space}(f(n)) \subsetneq \text{Space}((f(n)) \log f(n)).$$

Again, the version in the book is stronger: it states that for any proper $f(n)$ there exists a language A decidable in space $O(f(n))$ but not in space $o(f(n))$.

As a simple application of these Hierarchy Theorems, we can prove that $P \subsetneq \text{EXP}$ and $L \subsetneq \text{PSPACE}$.

3 Reductions and completeness

Recall the definitions of reducibilities from the last lecture. In this lecture, we will give some examples of many-one reductions \leq_m .

In the previous section we talked about several different variants of the halting problem, in particular variant called A_{TM} in the book, $A_{TM} = \{M, x \mid \text{TM } M \text{ accepts input } x\}$ and a variant with halting on blank tape, $\text{Halt}B = \{M \mid \text{TM } M \text{ halts when started on blank tape}\}$. Now we will show that these problems are essentially equivalent by showing that they can be reduced to each other.

Lemma 7. $\text{Halt}B \leq_m A_{TM}$.

Proof. We need to present a computable function f which takes instances of $\text{Halt}B$ and maps them to instances of A_{TM} , preserving the membership in the respective languages. That is, we need $f(\langle M \rangle) = \langle M', x \rangle$ such that $M \in \text{Halt}B$ iff $\langle M', x \rangle \in A_{TM}$. (recall that $\langle M \rangle$ is a string encoding the description of a Turing machine; we need the descriptions since languages are sets of strings). Consider the following M' :

```
M': simulate M starting with blank tape
    if M halted, accept
```

Technically M' is the same as M , except the rejecting state of M is an accepting state of M' . Now, set $x = \lambda$ (empty string).

Suppose that $M \in \text{Halt}B$. Then M' accepts when starting on blank tape, because M halts when starting on blank and both halting states of M are accepting states of M' . Now suppose that $M \notin \text{Halt}B$. Then the simulation of M will run forever, so M' will never have a chance to halt and accept. □

The reduction in other direction is a little bit more involved.

Lemma 8. $A_{TM} \leq_m \text{Halt}B$.

Proof. We construct a function f such that $f(\langle M \rangle, x) = \langle M' \rangle$. Note that in this case x becomes part of the description of M' . Define M' as follows:

```
M': write x on the tape
      simulate M on x
      if M rejects, go into infinite loop
```

The first step can be done by using $|x|$ new states, so x becomes encoded as a part of transition table. To go into infinite loop, two states should be enough: one moves left, another right, and they switch between each other independently of the tape contents. \square

Note that the relation \leq_m (as well as \leq_p and most other) is transitive. That is, if $L_1 \leq L_2$ and $L_2 \leq L_3$, then $L_1 \leq L_3$. The usefulness of the following definition is based on this fact.

Definition 9. For a complexity class C , we say that a language L is C -complete if

1. $L \in C$, and
2. every language in C is reducible to L .

Interpretation A C -complete language L is a “hardest” language in C (everybody else in C is at most as hard as L .)

Usefulness A C -complete language *captures* the complexity of the entire class C . So, we can reason about C by thinking about a single concrete problem from C .

We say that a language L is C -hard if every language in C is reducible to L (i.e., L may or may not be in C).