# 6.045

## Lecture 19: Space Complexity



## **Space Problems**







We measure *space* complexity by finding the *largest tape index reached* during the computation

Let M be a deterministic Turing machine (not necessarily halting)

**Definition:** The space complexity of M is the function  $S : \mathbb{N} \to \mathbb{N}$ , where S(n) is the largest tape index reached by M on any input of length n.

Definition: SPACE(S(n)) =
 { L | L is decided by a Turing machine with
 O(S(n)) space complexity}

## Theorem: 3SAT ∈ SPACE(n)

**Proof Idea:** Given formula  $\phi$  of length n, try all possible assignments A to the (at most n) variables. Evaluate  $\phi$  on each A, and accept iff you find A such that  $\phi(A) = 1$ . All of this can be done in O(n) space.

## **Theorem:** NTIME(t(n)) is in SPACE(t(n))

**Proof Idea:** Try all possible computation paths of t(n) steps for an NTM on length-n input. This can be done in O(t(n)) space (store a sequence of t(n) transitions).

#### **One Tape vs Many Tapes**

Theorem: Let  $s : \mathbb{N} \to \mathbb{N}$  satisfy  $s(n) \ge n$ , for all n. Then every s(n) space multi-tape TM has an equivalent O(s(n)) space one-tape TM

The simulation of multitape TMs by one-tape TMs already achieves this!

**Corollary:** The number of tapes doesn't matter for space complexity! **One tape TMs are as good as any other model!** 

#### **Space Hierarchy Theorem**

Intuition: If you have more *space* to work with, then you can solve strictly more problems!

Theorem: For functions s,  $S : \mathbb{N} \rightarrow \mathbb{N}$  where  $s(n)/S(n) \rightarrow 0$ SPACE(s(n))  $\subsetneq$  SPACE(S(n))

#### **Proof Idea: Diagonalization**

Make a Turing machine N that on input M, simulates the TM M on input <M> using up to S(|M|) space, then flips the answer.

Show L(N) is in SPACE(S(n)) but not in SPACE(s(n))

# $\begin{array}{l} \textbf{PSPACE} = \bigcup_{k \in \mathbb{N}} \textbf{SPACE(n^k)} \end{array}$

Since for every k, NTIME(n<sup>k</sup>) is in SPACE(n<sup>k</sup>), we have:

## $P \subseteq NP \subseteq PSPACE$

The class PSPACE formalizes the set of problems solvable by computers with *bounded memory*.

Fundamental (Unanswered) Question: How does time relate to space, in computing?

SPACE(n<sup>2</sup>) problems could potentially take much longer than n<sup>c</sup> time to solve, for *any* c!

Intuition: You can always re-use space, but how can you re-use time? Is P = PSPACE? **Time Complexity of SPACE[S(n)]** Let M be a halting TM with S(n) space complexity How many time steps could M possibly take on inputs of length n? *Is there an upper bound?* 

The number of time steps is at most the total number of possible *configurations*!

(If a configuration repeats, the machine is looping!)

A configuration of M specifies a head position, state, and S(n) cells of tape content. The total number of configurations is at most:  $S(n) |Q| |\Gamma|^{S(n)} = 2^{O(S(n))}$ 

## **Theorem:**

For every space-S(n) TM, there is a TM running in 2<sup>O(S(n))</sup> time that decides the same language.

# $\frac{\text{SPACE}(s(n)) \subseteq \bigcup \text{TIME}(2^{c \cdot s(n)})}{c \in N}$

Proof Idea: For each s(n)-space bounded TM M there is a c > 0 so that on all inputs x, if M runs for more than 2<sup>c s(|x|)</sup> time steps on x, then *M must have* repeated a configuration, so M will never halt.

# $\begin{array}{l} \textbf{PSPACE} = \bigcup SPACE(n^k) \\ k \in N \end{array}$

# **EXPTIME** = $\bigcup_{k \in \mathbb{N}} \text{TIME}(2^{n^k})$

# $\mathsf{PSPACE} \subseteq \mathsf{EXPTIME}$

# $P \subseteq NP \subseteq PSPACE$ $Is NP^{NP} \subseteq PSPACE?$ YES

## And $coNP^{NP} \subseteq PSPACE!$

**Example:** MIN-FORMULA is in PSPACE MIN-FORMULA = {  $\phi \mid \phi$  is minimal }

Recall the coNP<sup>NP</sup> algorithm for MIN-FORMULA:

Given a formula  $\phi$ , *Try all formulas*  $\psi$  such that  $\psi$  is smaller than  $\phi$ . If  $((\phi, \psi) \in NEQUIV)$  then *accept* else *reject* 

Can store a formula  $\psi$  in space  $O(|\phi|)$ Can check  $(\phi, \psi) \in NEQUIV$  by trying all assignments to the variables of  $\phi$  and  $\psi$ Can store a variable assignment in space  $O(|\phi|)$ Evaluating  $\psi$  or  $\phi$  on an assignment uses  $O(|\phi|)$  space



## $P \subseteq NP \subseteq PSPACE \subseteq EXPTIME$ **Theorem:** $P \neq EXPTIME$ Why? The Time Hierarchy Theorem! **TIME(2<sup>n</sup>)** ⊄ **P** Therefore **P** ≠ **EXPTIME Corollary:** At least one of the following is true: $P \neq NP$ , $NP \neq PSPACE$ , or $PSPACE \neq EXPTIME$

Proving any one of them would be major!

# PSPACE and Nondeterminism

Definition: SPACE(s(n)) =
{ L | L is decided by a Turing machine with
 O(s(n)) space complexity}

Definition: NSPACE(s(n)) =
{ L | L is decided by a non-deterministic
 Turing Machine with O(s(n)) space complexity}

## **Recall:**

Space S(n) computations can be simulated in at most 2<sup>O(S(n))</sup> time steps

# $\frac{\text{SPACE}(s(n)) \subseteq \bigcup \text{TIME}(2^{c \cdot s(n)})}{c \in N}$

Idea: After 2<sup>O(s(n))</sup> time steps, a s(n)-space bounded computation must have repeated a configuration, after which it will provably never halt.

#### **Theorem:**

NSPACE S(n) computations can also be simulated in at most 2<sup>O(S(n))</sup> time steps

# $\frac{\text{NSPACE}(s(n)) \subseteq \bigcup \text{TIME}(2^{c \cdot s(n)})}{c \in N}$

Key Idea: Think of the problem of simulating NSPACE(s(n)) as a problem on graphs.

**Def:** The configuration graph of M on x has nodes *C* for every configuration *C* of M on x, and edges (*C*, *C*') if and only if *C* yields *C*'



M accepts  $x \Leftrightarrow$  there is a path in  $G_{M,x}$  from the initial configuration node to a node in an accept state

M has space complexity S(n) $\Rightarrow G_{M,x}$  has  $2^{d \cdot S(|x|)}$  nodes

M is deterministic  $\Rightarrow$  every node has outdegree  $\leq 1$ 

M is nondeterministic ⇒ some nodes may have outdegree > 1 **Def:** The configuration graph of M on x has nodes *C* for every configuration *C* of M on x, and edges (*C*, *C*') if and only if *C* yields *C*'



To simulate a non-deterministic M in  $2^{O(S(|x|))}$  time: do BFS in  $G_{M,x}$ from the initial configuration! M has space complexity S(n) $\Rightarrow G_{M,x}$  has  $2^{d \cdot S(|x|)}$  nodes

M is deterministic  $\Rightarrow$  every node has outdegree  $\leq 1$ 

M is nondeterministic ⇒ some nodes may have outdegree > 1

# $\begin{array}{l} \textbf{PSPACE} = \bigcup_{k \in \mathbb{N}} \textbf{SPACE}(n^k) \\ \end{array}$

# $\begin{array}{l} \textbf{NPSPACE} = \bigcup & \textbf{NSPACE}(n^k) \\ k \in N \end{array}$

#### **SPACE versus NSPACE**

Is NTIME(n)  $\subseteq$  TIME(n<sup>2</sup>)?

Is NTIME(n)  $\subseteq$  TIME(n<sup>k</sup>) for some k > 1?

Nobody knows!

If the answer is yes, then P = NP in fact! What about the space-bounded setting?

Is NSPACE(s(n))  $\subseteq$  SPACE(s(n)<sup>k</sup>) for some k? Is PSPACE = NPSPACE?

#### Savitch's Theorem

Theorem: For functions s(n) where  $s(n) \ge n$ NSPACE $(s(n)) \subseteq$  SPACE $(s(n)^2)$ 

**Proof Try:** 

Let N be a con-deterministic The with space complex cy space

Construct a determining tic machine M that tries every polyible branch of the second s

Since each branch of N uses  $s_{F}$  ce at most s(n), then M uses mace at most s(n)....

There are 2<sup>(2<sup>s(n)</sup>)</sup> branches to keep track of!

Given configurations  $C_1$  and  $C_2$  of a s(n) space machine N, and a number k (in binary), want to know if N can get from  $C_1$  to  $C_2$  within  $2^k$  steps

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Procedure SIM(C<sub>1</sub>, C<sub>2</sub>, k):
   If k = 0 then accept iff C_1 = C_2 or
                                   C<sub>1</sub> yields C<sub>2</sub> within one step.
                                  [ uses space O(s(n)) ]
   If k > 0, then for every config C_m of O(s(n)) symbols,
                       if SIM(C<sub>1</sub>,C<sub>m</sub>,k-1) and SIM(C<sub>m</sub>,C<sub>2</sub>,k-1) accept
                            then return accept
                    return reject if no such C<sub>m</sub> is found
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SIM( $C_1$ ,  $C_2$ , k) has O(k) levels of recursion Each level of recursion uses O(s(n)) additional space. Theorem: SIM( $C_1$ ,  $C_2$ , k) uses only O(k  $\cdot$  s(n)) space Theorem: For functions s(n) where  $s(n) \ge n$ NSPACE $(s(n)) \subseteq$  SPACE $(s(n)^2)$ 

#### **Proof:**

Let N be a nondeterministic TM using s(n) space Let d > 0 be such that the number of configurations of N(w) is at most 2<sup>d s(|w|)</sup>

Here's a deterministic O(s(n)<sup>2</sup>) space algorithm for N:

M(w): For all configurations C<sub>a</sub> of N(w) in the accept state, If SIM(q<sub>o</sub>w, C<sub>a</sub>, d s(|w|)) accepts, then accept else reject

Claim: L(M) = L(N) and M uses O(s(n)<sup>2</sup>) space

Theorem: For functions s(n) where  $s(n) \ge n$ NSPACE $(s(n)) \subseteq$  SPACE $(s(n)^2)$ 

#### **Proof:**

Let N be a nondeterministic TM using s(n) space Let d > 0 be such that the number of configurations of N(w) is at most 2<sup>d s(|w|)</sup>

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Why does it take only s(n)<sup>2</sup> space?

**Theorem:** For functions s(n) where  $s(n) \ge n$ NSPACE(s(n))  $\subseteq$  SPACE(s(n)<sup>2</sup>)

#### **Proof:**

Let N be a nondeterministic TM using s(n) space Let d > 0 be such that the number of configurations of N(w) is at most 2<sup>d s(|w|)</sup>

Here's a deterministic O(s(n)<sup>2</sup>) space algorithm for N:

M(w): For all configurations C<sub>a</sub> of N(w) in the accept state, If SIM(q<sub>o</sub>w, C<sub>a</sub>, d s(|w|)) accepts, then *accept* else *reject* SIM uses  $O(k \cdot s(|w|))$  space to simulate  $2^k$  steps of N(w). For k = d s(|w|) we have  $O(k \cdot s(|w|)) \leq O(s(|w|)^2)$  space 30

# $PSPACE = \bigcup_{k \in \mathbb{N}} SPACE(n^k)$

## NPSPACE = $\bigcup$ NSPACE(n<sup>k</sup>) k $\in$ N PSPACE = NPSPACE!