



Computational Complexity Theory

Lecture 10: Space complexity classes; Savitch's theorem

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Space bounded computation

Space bounded computation

- Here, we are interested to find out how much of work space is required to solve a problem.
- For convenience, think of TMs with a separate read-only input tape and one or more work tapes. Work space is the number of cells in the work tapes of a TM **M** visited by **M**'s heads during a computation.

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- **Definition.** Let $S: \mathbb{N} \rightarrow \mathbb{N}$ be a function. A language L is in $DSPACE(S(n))$ if there's a TM M that decides L using $O(S(n))$ work space on inputs of length n .

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- **Definition.** Let $S: \mathbb{N} \rightarrow \mathbb{N}$ be a function. A language L is in $\text{NSPACE}(S(n))$ if there's a NTM M that decides L using $O(S(n))$ work space on inputs of length n , regardless of M 's nondeterministic choices.

Space bounded computation

- We'll refer to 'work space' as 'space'. For convenience, assume there's a single work tape.
- If the output has many bits, then we will assume that the TM has a separate write-only output tape.

Space bounded computation

- We'll refer to 'work space' as 'space'. For convenience, assume there's a single work tape.
- If the output has many bits, then we will assume that the TM has a separate write-only output tape.
- **Definition.** Let $S: \mathbb{N} \rightarrow \mathbb{N}$ be a function. S is space constructible if $S(n) \geq \log n$ and there's a TM that computes $S(|x|)$ from x using $O(S(|x|))$ space.

Relation between time and space

- Obs. $\text{DTIME}(S(n)) \subsetneq \text{DSPACE}(S(n)) \subseteq \text{NSPACE}(S(n))$.



Hopcroft, Paul & Valiant 1977

Relation between time and space

- **Obs.** $\text{DTIME}(S(n)) \subsetneq \text{DSPACE}(S(n)) \subseteq \text{NSPACE}(S(n))$.
- **Theorem.** $\text{NSPACE}(S(n)) \subseteq \text{DTIME}(2^{O(S(n))})$, if S is space constructible.
- **Proof.** Uses the notion of configuration graph of a TM. We'll see this shortly.

Relation between time and space

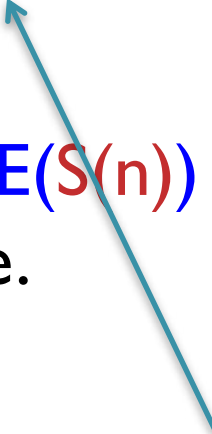
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Giving space at least $\log n$ gives a TM at least the power to remember the index of a cell.

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 - **Theorem.** $\text{NSPACE}(S(n)) \subseteq \text{DTIME}(2^{O(S(n))})$, if S is space constructible.
 - **Caution.** The *Hopcroft-Paul-Valiant* theorem does not imply $P \subsetneq \text{PSPACE}$.
 - **Open.** Is $P \neq \text{PSPACE}$?
- 

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- Theorem. $L \subseteq NL \subseteq P \subseteq NP \subseteq PSPACE \subseteq EXP$



Follows from the above theorem

Relation between time and space

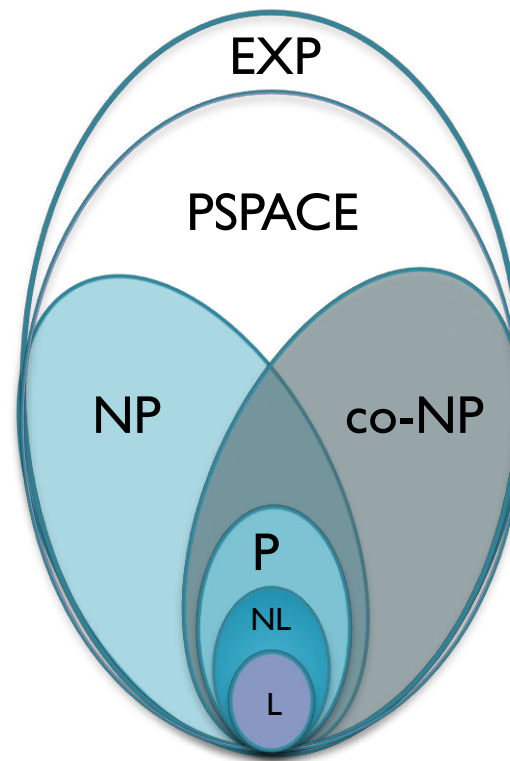
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Run through all possible choices of certificates of the verifier and **reuse** space.

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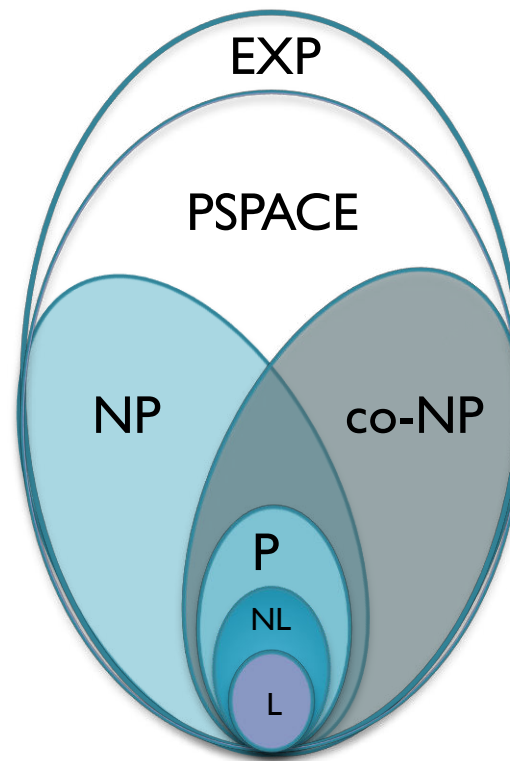


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Homework: Integer addition and multiplication are in (functional) L .

Integer division is also in (functional) L . (Chiu, Davida & Litow 2001)



Configuration graph

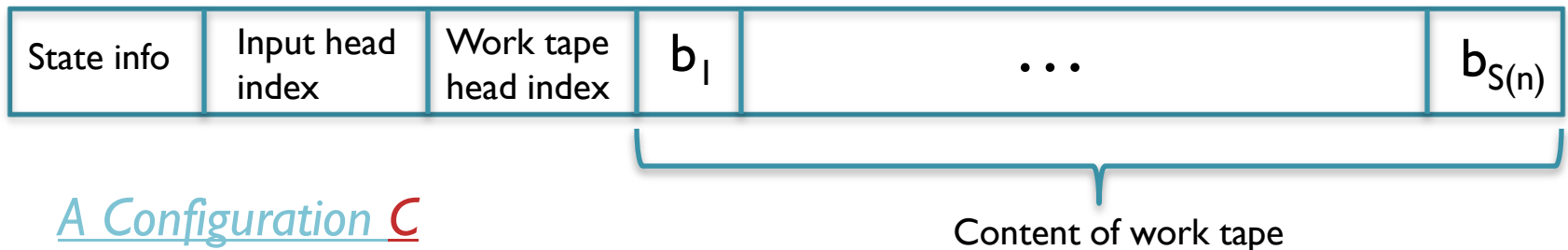
- **Definition.** A *configuration* of a TM **M** on input **x**, at any particular step of its execution, consists of
 - (a) the nonblank symbols of its work tapes,
 - (b) the current state,
 - (c) the current head positions.

It captures a ‘snapshot’ of **M** at any particular moment of execution.

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State info	Input head index	Work tape head index	b_1	...	$b_{S(n)}$
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Note: A configuration **C** can be represented using $O(S(n))$ bits if **M** uses $S(n) = \Omega(\log n)$ space on **n**-bit inputs.

Configuration graph

- **Definition.** A *configuration graph* of a TM M on input x , denoted $G_{M,x}$, is a directed graph whose nodes are all the possible configurations of M on input x . There's an edge from one configuration C_1 to another C_2 , if C_2 can be reached from C_1 by an application of M 's transition function(s).

Configuration graph

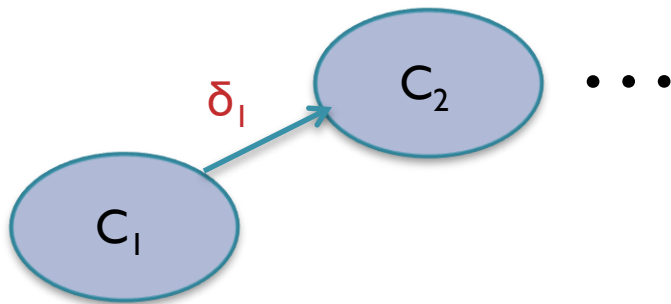
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- Number of nodes in $G_{M,x} = 2^{O(S(n))}$, if M uses $S(n)$ space on n -bit inputs

Configuration graph

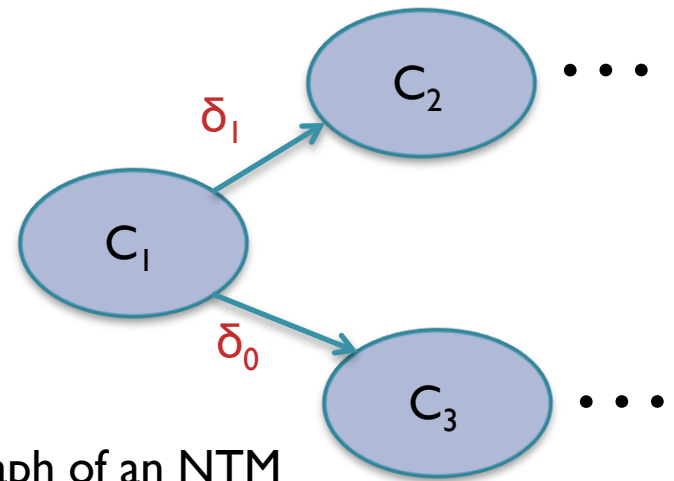
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- If M is a DTM then every node C in $G_{M,x}$ has at most one outgoing edge. If M is an NTM then every node C in $G_{M,x}$ has at most two outgoing edges.

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Conf. graph of a DTM



Conf. graph of an NTM

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- By erasing the contents of the work tape at the end, bringing the head at the beginning, and having a q_{accept} state, we can assume that there's a unique C_{accept} configuration. Configuration C_{start} is well defined.

Configuration graph

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- M accepts x if and only if there's a path from C_{start} to C_{accept} in $G_{M,x}$.

Relation between time and space

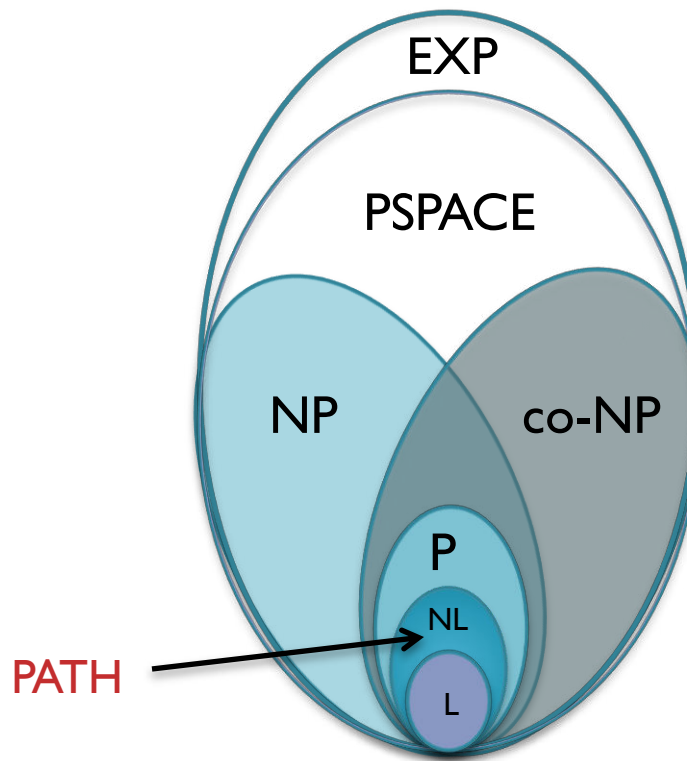
- **Obs.** $\text{DTIME}(S(n)) \subsetneq \text{DSPACE}(S(n)) \subseteq \text{NSPACE}(S(n))$.
- **Theorem.** $\text{NSPACE}(S(n)) \subseteq \text{DTIME}(2^{O(S(n))})$, if S is space constructible.
- **Proof.** Let $L \in \text{NSPACE}(S(n))$ and M be an NTM deciding L using $O(S(n))$ space on length n inputs.
- On input x , compute the configuration graph $G_{M,x}$ of M and check if there's a path from C_{start} to C_{accept} . Running time is $2^{O(S(n))}$.

Natural problems?

- Definition.
$$L = \text{DSPACE}(\log n)$$
$$NL = \text{NSPACE}(\log n)$$
$$\text{PSPACE} = \bigcup_{c > 0} \text{DSPACE}(n^c)$$
- Theorem. $L \subseteq NL \subseteq P \subseteq NP \subseteq \text{PSPACE} \subseteq \text{EXP}$.
- Are there natural problems in L , NL and PSPACE ?

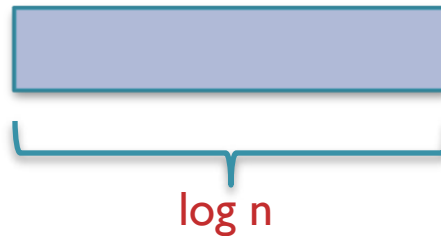
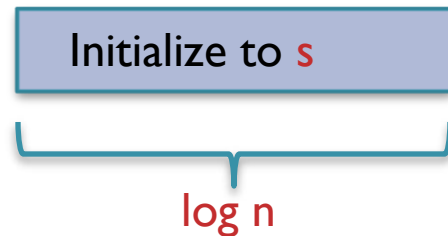
PATH: A canonical problem in NL

- **PATH** = $\{(G,s,t) : G \text{ is a directed graph having a path from } s \text{ to } t\}$.
- Obs. **PATH** is in **NL**.



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- **Proof.** Count the no. of vertices in **G**, let it be **n**. Set aside two memory locations of **log n** bits each. Initialize a counter, say **Count = m < n**.



Count = m

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Initialize to **s**

Guess a vertex **v₁**

Count = m

If there's a edge from **s** to **v₁**, decrease count by **1**.
Else o/p **0** and stop.

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Set to v_1

Guess a vertex v_2

Count = m-1

If there's a edge from v_1 to v_2 , decrease count by 1.
Else o/p 0 and stop.

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Set to v_2

Guess a vertex v_3

Count = m-2

If there's a edge from v_2 to v_3 , decrease count by 1.
Else o/p **0** and stop.

...and so on.

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- **Proof.** Count the no. of vertices in **G**, let it be **n**. Set aside two memory locations of **log n** bits each. Initialize a counter, say **Count = m < n**.

Set to v_{m-1}

Set to **t**

Count = 1

If there's a edge from v_{m-1}
to **t**, o/p **1** and stop.
Else o/p **0** and stop.

PATH: A canonical problem in NL

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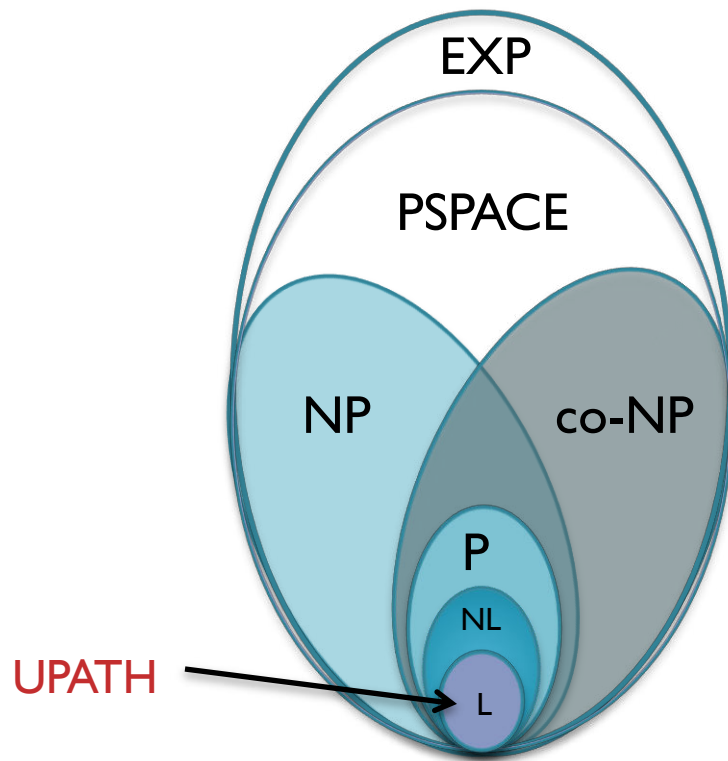
Count = 1

If there's a edge from v_{m-1}
to **t**, o/p **1** and stop.
Else o/p **0** and stop.

Space complexity = $O(\log n)$

UPATH: A problem in L

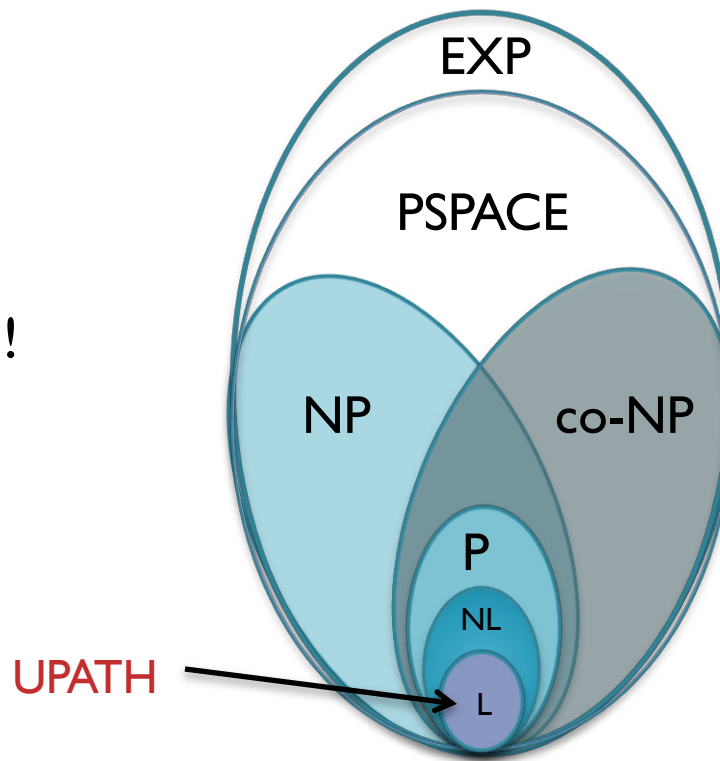
- **UPATH** = $\{(G,s,t) : G \text{ is an undirected graph having a path from } s \text{ to } t\}$.
- **Theorem** (*Reingold 2005*). **UPATH** is in **L**.



UPATH: A problem in L

- **UPATH** = $\{(G,s,t) : G \text{ is an undirected graph having a path from } s \text{ to } t\}$.
- **Theorem** (Reingold 2005). **UPATH** is in **L**.

Is **PATH** in **L** ?
If yes, then **L** = **NL** !
(will prove later)



Space Hierarchy Theorem

- **Theorem.** (*Stearns, Hartmanis & Lewis 1965*) If f and g are space-constructible functions and $f(n) = o(g(n))$, then $\text{SPACE}(f(n)) \subsetneq \text{SPACE}(g(n))$.
- **Proof.** Homework.
- **Theorem.** $L \subsetneq \text{PSPACE}$.

PSPACE = NPSPACE

Savitch's theorem

- **Theorem.** $\text{NSPACE}(S(n)) \subseteq \text{DSPACE}(S(n)^2)$, where $S(n)$ is space constructible. (So, $\text{PSPACE} = \text{NPSPACE}$)
- **Proof.** Let $L \in \text{NSPACE}(S(n))$, and M be an NTM requiring $O(S(n))$ space to decide L . We'll show that there's a TM N requiring $O(S(n)^2)$ space to decide L .

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- On input x , N checks if there's a path from C_{start} to C_{accept} in $G_{M,x}$ as follows: Let $|x| = n$.

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- **Proof.** (contd.) N computes $m = O(S(n))$, the no. of bits required to represent a configuration of M . It also finds out C_{start} and C_{accept} . Then N checks if there's a path from C_{start} to C_{accept} of length at most 2^m in $G_{M,x}$ recursively using the following procedure.
- $\text{REACH}(C_1, C_2, i)$: returns 1 if there's a path from C_1 to C_2 of length at most 2^i in $G_{M,x}$; 0 otherwise.

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Space constructibility of $S(n)$ used here

- **Proof.** (contd.) N computes $m = O(S(n))$, the no. of bits required to represent a configuration of M . It also finds out C_{start} and C_{accept} . Then N checks if there's a path from C_{start} to C_{accept} of length at most 2^m in $G_{M,x}$ recursively using the following procedure.
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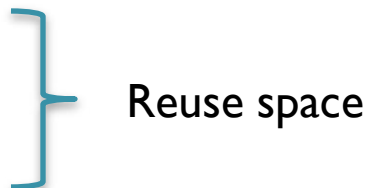
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- $\text{REACH}(C_1, C_2, i) \{$
 - If $i = 0$ check if C_1 and C_2 are adjacent.
 - Else, for every configurations C ,
 - $a_1 = \text{REACH}(C_1, C, i-1)$
 - $a_2 = \text{REACH}(C, C_2, i-1)$
 - if $a_1 = 1$ & $a_2 = 1$, return 1. Else return 0.
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}
- Require $O(S(n))$ space
-

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 - $a_2 = \text{REACH}(C, C_2, i-1)$ Reuse space
 - if $a_1 = 1$ & $a_2 = 1$, return 1. Else return 0.
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- **Theorem.** $\text{NSPACE}(S(n)) \subseteq \text{DSPACE}(S(n)^2)$, where $S(n)$ is space constructible. (So, $\text{PSPACE} = \text{NPSPACE}$)

- **Proof.**

$$\text{Space}(i) = \text{Space}(i-1) + O(S(n))$$

- Space complexity: $O(S(n)^2)$

Savitch's theorem

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- **Proof.**

$$\text{Space}(i) = \text{Space}(i-1) + O(S(n))$$

- Space complexity: $O(S(n)^2)$

$$\text{Time}(i) = 2^m \cdot \text{Time}(i-1) + O(S(n))$$

- Time complexity: $2^{O(S(n)^2)}$

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- **Proof.**

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- Space complexity: $O(S(n)^2)$

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- Time complexity: $2^{O(S(n)^2)}$ 

Recall, $\text{NSPACE}(S(n)) \subseteq \text{DTIME}(2^{O(S(n))})$.
There's an algorithm with time complexity $2^{O(S(n))}$, but higher space requirement.