### **Complexity Classes**

#### **Complexity Theory**

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### **Complexity Classes – Motivation**

- We have studied the relation of a complexity class of a certain type on a function which is used for its definition.
- Now, we will focus on investigating the relation between complexity classes of different types.
- Although a lot effort has been invested in this area in recent years, some problems (such as  $P \stackrel{?}{=} NP$ ) remain unsolved.

### Complexity Classes – Motivation



### Inclusion of Complexity Classes

We will show that the following chain of inclusions holds:

### $\textbf{DLOG} \subseteq \textbf{NLOG} \subseteq \textbf{P} \subseteq \textbf{NP} \subseteq \textbf{PSPACE} \subseteq \textbf{EXP} \subseteq \textbf{NEXP}$

To do this, we will prove the statements shown below:

- a) **DSPACE**(f(n))  $\subseteq$  **NSPACE**(f(n)),
- b)  $\mathsf{DTIME}(f(n)) \subseteq \mathsf{NTIME}(f(n)),$
- c) NTIME $(f(n)) \subseteq \bigcup_{c>0} \mathsf{DTIME}(c^{f(n)}),$
- d) **NTIME**(f(n))  $\subseteq$  **DSPACE**(f(n)),
- e) **NSPACE**(f(n))  $\subseteq$  **DTIME**( $2^{O(f(n))}$ ) for  $f(n) \ge \log n$ ,
- f) **NSPACE**(f(n))  $\subseteq$  **DSPACE**( $f(n)^2$ ) for  $f(n) \ge \log n$  (*Savitch's theorem*).

where f(n) is a time and space constructible function.

# Proof of the Inclusion of Complexity Classes (1/4)

#### Proof (Parts a, b, c, and d)

- Parts a) (DSPACE(f(n)) ⊆ NSPACE(f(n))) and
   b) (DTIME(f(n)) ⊆ NTIME(f(n))) are trivial since each deterministic TM is a special case of a nondeterministic TM.
- Part c) (NTIME(f(n))  $\subseteq \bigcup_{c>0}$  DTIME( $c^{f(n)}$ )) has been proven in the previous lecture.
- The inclusion d) (NTIME(f(n)) ⊆ DSPACE(f(n))) is a consequence of the proof of the proposition
  NTIME(f(n)) ⊆ DTIME(2<sup>f(n)</sup>). A nondeterministic TM M<sub>N</sub> can make at most f(n) nondeterministic choices. The deterministic TM M<sub>D</sub> simulating M<sub>N</sub> uses f(n) cells of the tape to represent the choices of M<sub>N</sub> and at most f(n) cells for simulating the tape of M<sub>N</sub>. M<sub>D</sub> simulates the possible runs of M<sub>N</sub> one by one.

# Proof of the Inclusion of Complexity Classes (2/4)

#### Proof (Part e)

- **NSPACE** $(f(n)) \subseteq \text{DTIME}(2^{O(f(n))})$  for  $f(n) \ge \log n$
- We will define the configuration graph G(M, w) of an NTM M with the input w. The vertices of the graph G(M, w) are configurations that may occur during a computation of M on w. There is an edge between the vertices C<sub>1</sub> and C<sub>2</sub> iff M can do a transition from the configuration C<sub>1</sub> to C<sub>2</sub> in a single step.
- We ask whether there is a path from the vertex denoting the initial configuration to the vertex representing the accepting one.
- For each input *w*, the number of vertices of *G*(*M*, *w*) can be upper-bounded by 2<sup>*O*(log |*w*|+*f*(|*w*|))</sup>.
- The already known algorithm REACHABILITY can solve the problem in time O(m<sup>2</sup>) for graphs with m vertices. Therefore, the overall time complexity of a DTM simulating M is 2<sup>O(log n+f(n))</sup>.

# Proof of the Inclusion of Complexity Classes (3/4)

#### Proof (Part f)

- **NSPACE** $(f(n)) \subseteq$  **DSPACE** $(f(n)^2)$  for  $f(n) \ge \log n$  (Savitch's th.)
- First, we will show that REACHABILITY  $\in$  **DSPACE**(log<sup>2</sup> *n*).
- Let G be a graph with n vertices.
- Let *x*, *y* be two distinct vertices from *G*.
- Then, the longest path from x to y can have at most length n.
- We use a DTM to implement the procedure path(x, y, i) which returns true iff there exists a path from x, y of length at most 2<sup>i</sup>. procedure path(x, y, i) if (i = 0) then return ((x = y) ∨ ((x, y) ∈ G)) else for all vertices z ∈ G do if (path(x, z, i-1) ∧ path(z, y, i-1)) then return true return false

# Proof of the Inclusion of Complexity Classes (4/4)

### Proof (Part f)

- Recursive calls of path(x, y, i) create a tree of depth i.
- For our problem, it suffices to check whether path(x, y, [log n]) holds.
- The DTM implementing the path procedure will have to store call stack with at most [log n] triplets of length 3 · log n.
- Therefore, the space complexity of REACHABILITY is O(log<sup>2</sup> n).
- For a NTM M<sub>N</sub> we can create a DTM M<sub>D</sub> which uses another DTM deciding REACHABILITY for each accepting configuration of M<sub>N</sub>.
- The number of vertices of  $G(M_N, w)$  cannot be bigger than  $c^{f(|w|)}$ .
- Thus, the space complexity of  $M_D$  is  $O(\log^2 c^{f(n)}) = O(f(n)^2)$ .

### Inclusion of Complexity Classes: Conclusion

We have shown that

### $\textbf{DLOG} \subseteq \textbf{NLOG} \subseteq \textbf{P} \subseteq \textbf{NP} \subseteq \textbf{PSPACE} \subseteq \textbf{EXP} \subseteq \textbf{NEXP}$

- We expect all inclusion to be proper but for none of them has this been either proved or refuted yet.
- However, because of Time/Space Hierarchy Theorems (not covered here), it is known that some inclusions need to be proper. It is known that:

 $DLOG \subset PSPACE$  $P \subset EXP$  $NP \subset NEXP$ 

### Definition of Complements of Complexity Classes (1/2)

#### Definition

Let  $L \subseteq \Sigma^*$  be a language. The complement of L denoted co–L is the language

$$co-L = \Sigma^* \setminus L.$$

The same approach can be extended for decision problems.

#### Definition

The complement of a decision problem A, denoted A–COMPL, is a problem for which the solution is:

 $\begin{array}{rcl} \textit{yes} & \Longleftrightarrow & \textit{the solution for A is no} \\ \textit{no} & \leftrightarrow & \textit{the solution for A is yes} \end{array}$ 

Formally, *A*–*COMPL* is not a complement of a language because  $A \cup A$ –*COMPL*  $\neq \Sigma^*$ .

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### Definition of Complements of Complexity Classes (2/2)

#### Definition

Let C be a complexity class. The complement of C, denoted co-C, is the complexity class

$$co-C = \{co-L \mid L \in C\}.$$

- Clearly, deterministic time and space complexity classes are closed under complement:
- each DTM accepting L can be transformed into a DTM accepting co-L by swapping accepting and rejecting states.

$$\mathsf{DTIME}(f(n)) = co-\mathsf{DTIME}(f(n))$$

$$DSPACE(f(n)) = co-DSPACE(f(n))$$

### Complements of Nondeterministic Complexity Classes

- Nondeterminism introduces an asymmetry in acceptance of a given input by NTM M:
  - $w \in L(M) \iff$  there is an accepting run of M on w,  $w \notin L(M) \iff$  there is no accepting run of M on w.
- Thus, it suffices that one accepting computation exists for the former case but it is required that all computations are rejecting for the latter one.

### Nondeterministic Space Complexity Classes (1/8)

Proposition (Immerman-Szelepcsényi Theorem)

NSPACE(f(n)) = co-NSPACE(f(n)) for  $f \ge \log n$ 

- We have seen that *REACHABILITY* is in **NLOGSPACE**.
- First, we will demonstrate that the converse of *REACHABILITY*, called *UNREACHABILITY*, is in **NLOGSPACE** too.

#### Definition

UNREACHABILITY

- Input: Graph G = (V, E), a pair of vertices  $x, y \in V$ .
- Output: YES if there is no path from x to y, NO otherwise.

#### Proposition

### UNREACHABILITY E NLOGSPACE

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# Nondeterministic Space Complexity Classes (2/8)

#### Proof (UNREACHABILITY ∈ NLOGSPACE)

- We will first devise an algorithm that computes the number of reachable nodes in a graph in O(log n) space,
  - and later modify it to solve UNREACHABILITY.
- Let G = (V, E) be a graph and  $x \in V$ .
- $\blacksquare$  *S*(*k*) is the set of nodes reachable from *x* in *k* or less steps,
  - |S(k)| is the number of nodes reachable from x in k or less steps.
- adjac(v, u) is true iff  $v = u \lor (v, u) \in E$ , otherwise false.
  - **procedure** numReachable(x, (V, E))
    - nondeterministically either **FAILs** or returns the number of nodes reachable from *x*,
    - we will start with a procedure working in O(n) space and modify it in several steps to use O(log n) space.

### Nondeterministic Space Complexity Classes (3/8)

#### 

procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V|-1 do
 compute |S(k)| from |S(k-1)|

#### **return** |S(|V|-1)|

### Nondeterministic Space Complexity Classes (4/8)

#### 

```
procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V|-1 do
//compute |S(k)| from |S(k-1)|
l := 0
for each node u := 1 to |V| do
if u \in S(k) then l++
```



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## Nondeterministic Space Complexity Classes (4/8)

```
procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V|-1 do
//compute |S(k)| from |S(k-1)|
    ℓ := 0
    for each node u := 1 to |V| do
        if u ∈ S(k) then ℓ++
```

```
|S(k)| := ℓ
return |S(|V|−1)|
```

### Nondeterministic Space Complexity Classes (5/8)

```
procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V|-1 do
//compute |S(k)| from |S(k-1)|
l := 0
for each node u := 1 to |V| do
// if u \in S(k) then l++
reply := false
for each node v := 1 to |V| do
if v \in S(k-1) then
if adjac(v, u) then reply := true
```

```
if reply then l++
|S(k)| := l
return |S(|V|-1)|
```

## Nondeterministic Space Complexity Classes (5/8)

```
procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V| - 1 do
//compute |S(k)| from |S(k-1)|
 \ell := 0
  for each node u := 1 to |V| do
// if u \in S(k) then \ell + +
    reply := false
    for each node v := 1 to |V| do
      if \mathbf{v} \in S(k-1) then
         if adjac(v, u) then reply := true
    if reply then \ell + +
  |S(k)| := \ell
return |S(|V|-1)|
```

### Nondeterministic Space Complexity Classes (6/8)

```
procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V| - 1 do
//compute |S(k)| from |S(k-1)|
 \ell := 0
  for each node u := 1 to |V| do
// if u \in S(k) then \ell + +
    reply := false, m := 0
    for each node v := 1 to |V| do
      if reachNondet(x, v, k-1) then m++ // v \in S(k-1)
        if adjac(v, u) then reply := true
    if m < |S(k-1)| then FAIL
    if reply then \ell + +
  |S(k)| := \ell
return |S(|V|-1)|
```

### Nondeterministic Space Complexity Classes (6/8)

#### 

```
procedure numReachable(x, (V, E))
|S(0)| := 1
                                       guesses path from x to v of
for k := 1 to |V| - 1 do
                                       length at most k-1:
//compute |S(k)| from |S(k-1)|
                                       returns true iff path is OK,
  \ell \cdot = 0
                                       false if path is wrong
  for each node u := 1 to |V| do
// if u \in S(k) then \ell + +
    reply := false, m := &
    for each node v := 1 to |V| do
      if reachNondet(x, v, k-1) then m++ // v \in S(k-1)
         if adjac(v, u) then reply := true
    if m < |S(k-1)| then FAIL
                                     if calls to reachNondet () did
    if reply then l++
                                     not guess all the paths correctly,
  |S(k)| := \ell
                                     terminate the computation
return |S(|V|-1)|
```

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### Nondeterministic Space Complexity Classes (6/8)

#### Proof (UNREACHABILITY ∈ NLOGSPACE)

```
procedure numReachable(x, (V, E))
|S(0)| := 1
for k := 1 to |V| - 1 do
//compute |S(k)| from |S(k-1)|
 \ell := 0
  for each node u := 1 to |V| do
// if u \in S(k) then \ell + +
    reply := false, m := 0
    for each node v := 1 to |V| do
      if reachNondet(x, v, k-1) then m++ // v \in S(k-1)
        if adjac(v, u) then reply := true
    if m < |S(k-1)| then FAIL
    if reply then \ell + +
  |S(k)| := \ell
return |S(|V|-1)|
```

## Nondeterministic Space Complexity Classes (7/8)

#### Proof (UNREACHABILITY ∈ NLOGSPACE)

```
procedure reachNondet(x, v, d)
w0 := x
for p := 1 to d do
    guess a node wp
    if ¬adjac(wp-1, wp) then return false
return (wd = v)
```

### ■ For UNREACHABILITY(G, x, y), modify numReachable():

if m < |S(k-1)| then return false if reply then  $\ell + +$ if k = |V|-1 and u = y then return  $\neg reply$ 

### Nondeterministic Space Complexity Classes (8/8)

#### Proof (UNREACHABILITY ∈ NLOGSPACE)

- UNREACHABILITY can be implemented using a NTM M that works in space O(log n).
- *M* keeps binary values of | S (k-1) |, ℓ, k, u, v, m, reply, p, w<sub>p</sub>, w<sub>p-1</sub> on separate tapes.
- Variables are only incremented or compared with each other.
- Values of all variables are at most |V|, their length at most  $\log |V|$ .

# Nondeterministic Space Complexity Classes (7/7)

Proposition (Immerman-Szelepcsényi Theorem)

NSPACE(f(n)) = co-NSPACE(f(n)) for  $f \ge \log n$ 

#### Proof

- Let L ∈ NSPACE(f(n)) be a language decided by a NTM M<sub>N</sub> and let w be its input.
- We can construct a DTM M<sub>D</sub> working in NSPACE(f(n)) deciding co-L.
- M<sub>D</sub> simulates the UNREACHABILITY algorithm for the configuration graph G(M, w).

#### Corrolary

### $NPSPACE(f(n)) = co-NPSPACE(f(n)), \dots$

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### Nondeterministic Time Complexity Classes (1/2)

We have seen that

$$\mathsf{NTIME}(f(n)) \subseteq \bigcup_{c>0} \mathsf{DTIME}(c^{f(n)})$$

■ Each problem from class **NTIME**(f(n)) can be deterministically decided in time  $\bigcup_{c>0}$  **DTIME**( $c^{f(n)}$ ).

#### Corrolary

$$co-NTIME(f(n)) \subseteq \bigcup_{c>0} DTIME(c^{f(n)})$$

### Nondeterministic Time Complexity Classes (2/2)

Relationship between complements of nondeterministic time complexity classes remains unsolved:

$$\mathbf{NTIME}(f(n)) \stackrel{?}{=} co - \mathbf{NTIME}(f(n))$$

#### Corrolary

$$\mathbf{NP}(f(n)) \stackrel{?}{=} co - \mathbf{NP}(f(n))$$

#### Corrolary

$$\mathbf{NEXP}(f(n)) \stackrel{?}{=} co - \mathbf{EXP}(f(n))$$