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### Two startling theorems

- Strongly believe  $P \neq NP$
- nondeterminism seems to add enormous power
- for space: Savitch '70:
  - $NPSPACE = PSPACE$
  - and
  - $NL \subseteq SPACE(\log^2 n)$

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### Two startling theorems

- Strongly believe  $NP \neq coNP$
- seems impossible to convert existential into universal
- for space: Immerman/Szelepcsényi '87/'88:
  - $NL = coNL$

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### Savitch's Theorem

**Theorem:**  $STCONN \subseteq SPACE(\log^2 n)$

- Corollary:  $NL \subseteq SPACE(\log^2 n)$
- Corollary:  $NPSPACE = PSPACE$

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### Proof of Theorem

- input:  $G = (V, E)$ , two nodes  $s$  and  $t$
- recursive algorithm:

```

/* return true iff path from x to y of length at most 2^i */
PATH(x, y, i)
if i = 0 return ( x = y or (x, y) ∈ E ) /* base case */
for z in V
  if PATH(x, z, i-1) and PATH(z, y, i-1) return(true);
return(false);
end
  
```

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### Proof of Theorem

- answer to STCONN:  $PATH(s, t, \log n)$
- space used:
  - (depth of recursion) x (size of "stack record")
- depth =  $\log n$
- claim stack record: "(x, y, i)" sufficient
  - size  $O(\log n)$
- when return from  $PATH(a, b, i)$  can figure out what to do next from record (a, b, i) and previous record

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## Nondeterministic space

- Robust nondeterministic space classes:

$$NL = NSPACE(\log n)$$

$$NSPACE = \cup_k NSPACE(n^k)$$

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## Second startling theorem

- Strongly believe  $NP \neq coNP$
- seems impossible to convert existential into universal
- for space: Immerman/Szelepcényi '87/'88:

$$NL = coNL$$

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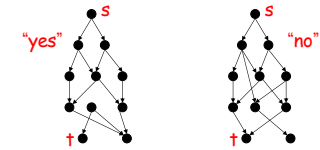
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## I-S Theorem

**Theorem:**  $ST\text{-}NON\text{-}CONN \in NL$

- Proof: slightly tricky setup:
  - input:  $G = (V, E)$ , two nodes  $s, t$



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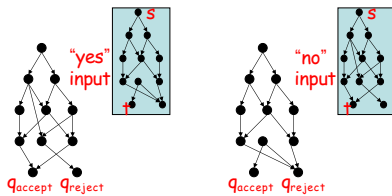
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## I-S Theorem

- want nondeterministic procedure using only  $O(\log n)$  space with behavior:



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## I-S Theorem

- observation: given **count** of # nodes reachable from  $s$ , can solve problem
  - for each  $v \in V$ , *guess* if it is reachable
  - if yes, *guess* path from  $s$  to  $v$ 
    - if guess doesn't lead to  $v$ , reject.
    - if  $v = t$ , reject.
    - else counter++
  - if counter = **count** accept

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## I-S Theorem

- every computation path has sequence of guesses...
- only way computation path can lead to accept:
  - correctly guessed reachable/unreachable for each node  $v$
  - correctly guessed path from  $s$  to  $v$  for each reachable node  $v$
  - saw *all* reachable nodes
  - $t$  not among reachable nodes

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## I-S Theorem

- $R(i)$  = # nodes reachable from  $s$  in at most  $i$  steps
- $R(0) = 1$ : node  $s$
- we will compute  $R(i+1)$  from  $R(i)$  using  $O(\log n)$  space and nondeterminism
- computation paths with "bad guesses" all lead to reject

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## I-S Theorem

- Outline: in  $n$  phases, compute  $R(1), R(2), R(3), \dots, R(n)$
- only  $O(\log n)$  bits of storage between phases
- in end, lots of computation paths that lead to reject
- only computation paths that survive have computed correct value of  $R(n)$
- apply observation.

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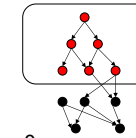
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## I-S Theorem

- computing  $R(i+1)$  from  $R(i)$ :



$R(i) = R(2) = 6$

- Initialize  $R(i+1) = 0$
- For each  $v \in V$ , *guess* if  $v$  reachable from  $s$  in at most  $i+1$  steps

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## I-S Theorem

- if "yes", *guess* path from  $s$  to  $v$  of at most  $i+1$  steps. Increment  $R(i+1)$
- if "no", visit  $R(i)$  nodes reachable in at most  $i$  steps, check that none is  $v$  or adjacent to  $v$ 
  - for  $u \in V$  *guess* if reachable in  $\leq i$  steps; *guess* path to  $u$ ; counter++
  - **KEY: if counter  $\neq R(i)$ , reject**
  - at this point: **can be sure  $v$  not reachable**

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## I-S Theorem

- correctness of procedure:
  - two types of errors we can make
  - (1) might guess  $v$  is reachable in at most  $i+1$  steps when it is not
    - won't be able to guess path from  $s$  to  $v$  of correct length, so we will reject.
- "easy" type of error

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## I-S Theorem

- (2) might guess  $v$  is **not** reachable in at most  $i+1$  steps when it is
    - then must **not** see  $v$  or neighbor of  $v$  while visiting nodes reachable in  $i$  steps.
    - but forced to visit  $R(i)$  distinct nodes
    - therefore must try to visit node  $v$  that is **not** reachable in  $\leq i$  steps
    - won't be able to guess path from  $s$  to  $v$  of correct length, so we will reject.
- "easy" type of error

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## Summary

- nondeterministic space classes  
**NL** and **NSPACE**
- ST-CONN **NL**-complete

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## Summary

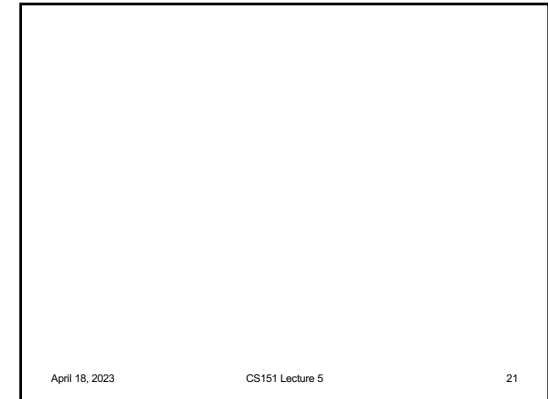
- Savitch: **NSPACE = PSPACE**
  - Proof: ST-CONN  $\in$  **SPACE**( $\log^2 n$ )
  - open question:  
**NL = L?**
- Immerman/Szelepcsényi : **NL = coNL**
  - Proof: ST-NON-CONN  $\in$  **NL**

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## Introduction

Power from an unexpected source?

- we know **P**  $\neq$  **EXP**, which implies no poly-time *algorithm* for Succinct CVAL
- poly-size Boolean *circuits* for Succinct CVAL ??

Does **NP** have **linear-size, log-depth** Boolean circuits ??

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## Outline

- Boolean circuits and formulas
- uniformity and advice
- the **NC** hierarchy and parallel computation
- the quest for circuit lower bounds
- a lower bound for formulas

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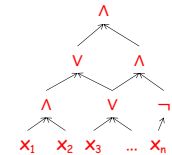
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## Boolean circuits

### • circuit C

- directed acyclic graph
- nodes: AND ( $\wedge$ ); OR ( $\vee$ ); NOT ( $\neg$ ); variables  $x_i$



- C computes function  $f: \{0,1\}^n \rightarrow \{0,1\}$  in natural way

- identify C with function **f** it computes

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## Boolean circuits

- **size** = # gates
- **depth** = longest path from input to output
- **formula (or expression)**: graph is a tree
- every function  $f: \{0,1\}^n \rightarrow \{0,1\}$  computable by a circuit of size at most  $O(n2^n)$ 
  - AND of  $n$  literals for each  $x$  such that  $f(x) = 1$
  - OR of up to  $2^n$  such terms

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## Circuit families

- circuit works for specific input length
- we're used to  $f: \Sigma^* \rightarrow \{0,1\}$
- circuit **family**: a circuit for each input length  $C_1, C_2, C_3, \dots = \{C_n\}$
- " $\{C_n\}$  computes  $f$ " iff for all  $x$   
 $C_{|x|}(x) = f(x)$
- " $\{C_n\}$  decides  $L$ ", where  $L$  is the language associated with  $f$

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## Connection to TMs

- given TM  $M$  running in time  $t(n)$  decides language  $L$
- can build circuit family  $\{C_n\}$  that decides  $L$ 
  - size of  $C_n = O(t(n)^2)$
  - Proof: CVAL construction
- Conclude:  $L \in P$  implies family of polynomial-size circuits that decides  $L$

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## Connection to TMs

- other direction?
- A poly-size circuit family:
  - $C_n = (x_1 \vee \neg x_1)$  if  $M_n$  halts
  - $C_n = (x_1 \wedge \neg x_1)$  if  $M_n$  loops
- decides (unary version of) HALT!
- oops...

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## Uniformity

- Strange aspect of circuit family:
  - can "encode" (potentially uncomputable) information in family specification
- solution: **uniformity** – require specification is simple to compute
- **Definition**: circuit family  $\{C_n\}$  is **logspace uniform** iff TM  $M$  outputs  $C_n$  on input  $1^n$  and runs in  $O(\log n)$  space

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## Uniformity

- **Theorem**:  $P =$  languages decidable by logspace uniform, polynomial-size circuit families  $\{C_n\}$ .
- Proof:
  - already saw ( $\Rightarrow$ )
  - ( $\Leftarrow$ ) on input  $x$ , generate  $C_{|x|}$ , evaluate it and accept iff output = 1

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## TMs that take advice

- family  $\{C_n\}$  without uniformity constraint is called “**non-uniform**”
- regard “non-uniformity” as a limited resource just like time, space, as follows:
  - add read-only “advice” tape to TM  $M$
  - $M$  “decides  $L$  with advice  $A(n)$ ” iff
    - $M(x, A(|x|))$  accepts  $\Leftrightarrow x \in L$
  - note:  $A(n)$  depends only on  $|x|$

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## TMs that take advice

- Definition: **TIME** $(t(n))/f(n)$  = the set of those languages  $L$  for which:
  - there exists  $A(n)$  s.t.  $|A(n)| \leq f(n)$
  - TM  $M$  decides  $L$  with advice  $A(n)$  in time  $t(n)$
- most important such class:
  - P/poly** =  $\cup_k \text{TIME}(n^k)/n^k$

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## TMs that take advice

**Theorem:**  $L \in \text{P/poly}$  iff  $L$  decided by family of (non-uniform) polynomial size circuits.

- Proof:
  - $(\Rightarrow)$   $C_n$  from CVAL construction; hardwire advice  $A(n)$
  - $(\Leftarrow)$  define  $A(n) =$  description of  $C_n$ ; on input  $x$ , TM simulates  $C_{|x|}(x)$

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## Approach to P/NP

- Believe **NP**  $\neq$  **P**
  - equivalent: “**NP** does not have uniform, polynomial-size circuits”
- Even believe **NP**  $\notin$  **P/poly**
  - equivalent: “**NP** (or, e.g. SAT) does not have polynomial-size circuits”
  - implies **P**  $\neq$  **NP**
  - many believe: best hope for **P**  $\neq$  **NP**

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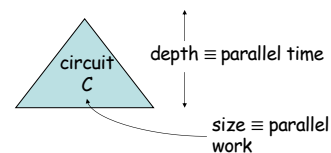
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## Parallelism

- uniform circuits allow refinement of polynomial time:



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## Parallelism

- the **NC** (“Nick’s Class”) Hierarchy (of logspace uniform circuits):
  - $\text{NC}_k = O(\log^k n)$  depth,  $\text{poly}(n)$  size
  - $\text{NC} = \cup_k \text{NC}_k$
- captures “efficiently parallelizable problems”
- not realistic? overly generous
- OK for proving non-parallelizable

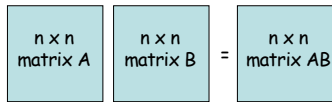
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## Matrix Multiplication



- what is the parallel complexity of this problem?
  - work = poly(n)
  - time = log<sup>k</sup>(n)? (which k?)

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## Matrix Multiplication

- two details
  - arithmetic matrix multiplication...
 
$$A = (a_{i,k}) \quad B = (b_{k,j}) \quad (AB)_{i,j} = \sum_k (a_{i,k} \times b_{k,j})$$
  - ... vs. Boolean matrix multiplication:
 
$$A = (a_{i,k}) \quad B = (b_{k,j}) \quad (AB)_{i,j} = \vee_k (a_{i,k} \wedge b_{k,j})$$
  - single output bit: to make matrix multiplication a language: on input  $A, B, (i, j)$  output  $(AB)_{i,j}$

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## Matrix Multiplication

- Boolean Matrix Multiplication is in  $NC_1$ 
  - level 1: compute n ANDs:  $a_{i,k} \wedge b_{k,j}$
  - next log n levels: tree of ORs
  - $n^2$  subtrees for all pairs  $(i, j)$
  - select correct one and output

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## Boolean formulas and $NC_1$

- Previous circuit is actually a formula. This is no accident:

**Theorem:**  $L \in NC_1$  iff decidable by polynomial-size uniform\* family of Boolean formulas.

\* DSPACE(log<sup>2</sup> n)-uniform

Note: we measure formula size by leaf-size.

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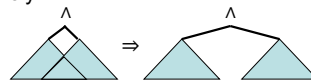
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## Boolean formulas and $NC_1$

- Proof:
  - ( $\Rightarrow$ ) convert  $NC_1$  circuit into formula
  - recursively:



- note: logspace transformation (stack depth log n, stack record 1 bit – “left” or “right”)

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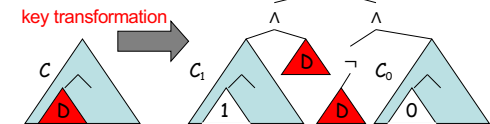
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## Boolean formulas and $NC_1$

- ( $\Leftarrow$ ) convert formula of size n into formula of depth  $O(\log n)$ 
  - note: size  $\leq 2^{\text{depth}}$ , so new formula has poly(n) size



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## Boolean formulas and $NC_1$

- D any **minimal subtree** with size at least  $n/3$ 
  - implies  $\text{size}(D) \leq 2n/3$
- define  $T(n)$  = maximum depth required for any size  $n$  formula
- $C_1, C_0, D$  all size  $\leq 2n/3$ 
$$T(n) \leq T(2n/3) + 3$$

implies  $T(n) \leq O(\log n)$

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## Relation to other classes

- Clearly  $NC \subseteq P$ 
  - recall  $P \equiv$  uniform poly-size circuits
- $NC_1 \subseteq L$ 
  - on input  $x$ , compose **logspace** algorithms for:
    - generating  $C_{|x|}$
    - converting to formula
    - FVAL

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## Relation to other classes

- $NL \subseteq NC_2$ : S-T-CONN  $\in NC_2$ 
  - given  $G = (V, E)$ , vertices  $s, t$
  - $A$  = adjacency matrix (with self-loops)
  - $(A^2)_{i,j} = 1$  iff path of length  $\leq 2$  from node  $i$  to node  $j$
  - $(A^n)_{i,j} = 1$  iff path of length  $\leq n$  from node  $i$  to node  $j$
  - compute with **depth  $\log n$**  tree of Boolean matrix multiplications, output entry  $s, t$
  - $\log^2 n$  depth total

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## NC vs. P

- can every **efficient algorithm** be efficiently parallelized?
$$NC \stackrel{?}{=} P$$
- **P**-complete problems least-likely to be parallelizable
  - if **P**-complete problem is in **NC**, then  $P = NC$
  - Why?
    - we use logspace reductions to show problem **P**-complete; **L** in **NC**

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## NC vs. P

- can every **uniform, poly-size Boolean circuit family** be converted into a uniform, poly-size Boolean **formula family**?
$$NC_1 \stackrel{?}{=} P$$

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