

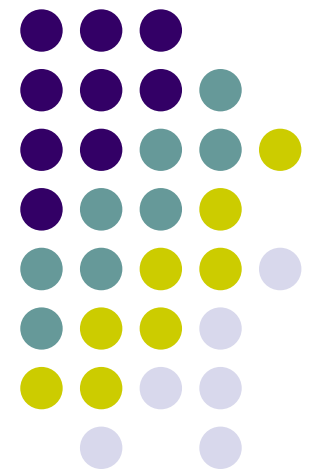
# CS256

# Applied Theory of Computation

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Introduction &  
Complexity Classes I

John E Savage

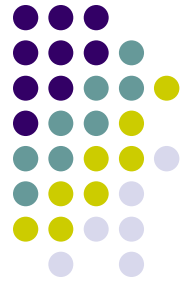




# Outline of the Course

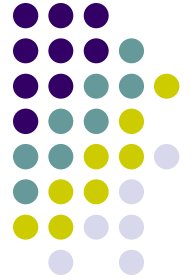
- Serial and parallel complexity classes – 3 lectures
- Approximation to NP-hard problems – 5 lectures
- Circuit complexity – 6 lectures
- Space-time tradeoffs – 4 lectures
- Memory hierarchies & I/O-space tradeoffs – 3 lects
- Parallel computation & classification – 4 lectures
- VLSI model,  $AT^2$  tradeoffs, & algorithms – 4 lectures
- Quantum computation – 3 lectures

# Background on Machine Models

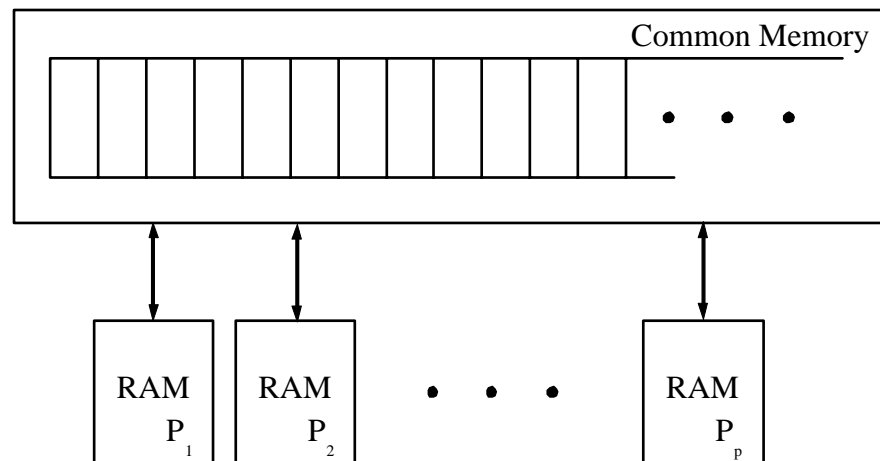


- Memoryless serial and parallel machines
  - Logic & algebraic circuits (ring, field ops)
- Serial machines: RAM & TM
  - Memory hierarchies
- Parallel machines with memory
  - Fine- vs coarse-grained computers
  - PRAM -  $p$  RAMs with shared memory

# Background on Machine Models (cont.)



- Parallel machines with memory (cont.)
  - PRAM -  $p$  RAMs with shared memory

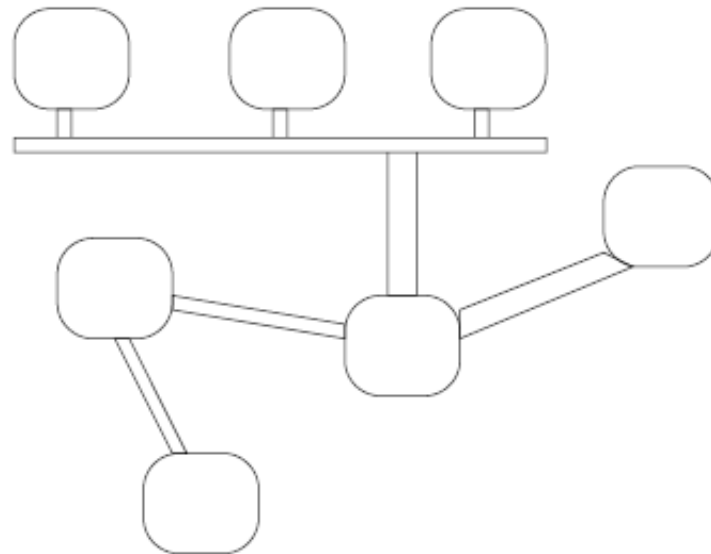


- Loosely coupled network of computers
- VLSI model

# Background on Machine Models (cont.)



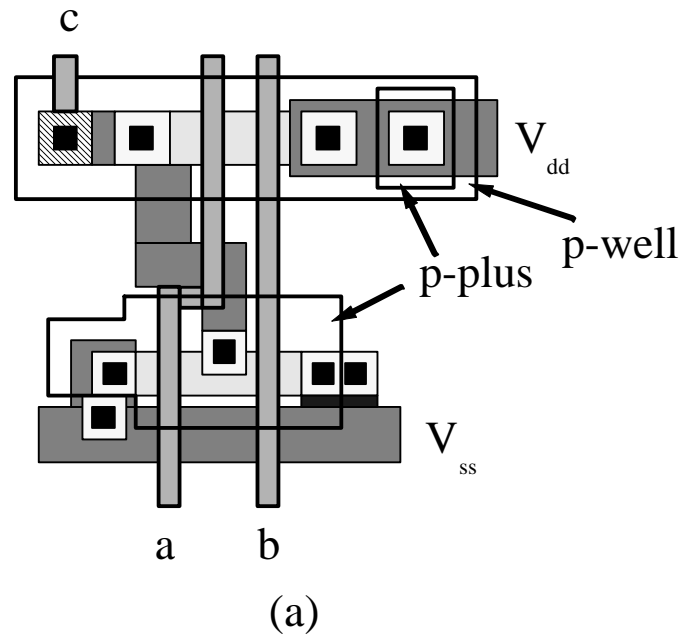
- Loosely coupled models

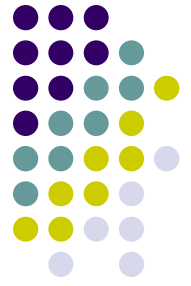


# Background on Machine Models (cont.)



- VLSI model





# Performance Metrics

- Logical and algebraic circuits – circuit size & dept
- RAM and TM – Time & space
- Parallel machines – Time, no. processors, & space
- Memory hierarchies – I/O time vs primary storage
- Distributed computing
  - Time  $T(n)$  to send length  $n$  message over single channel satisfies  $T = l + nb$  where  $l$  is latency and  $b$  is bandwidth.

# Complexity Classes I

## Decision Problems and Classes



- Problems are classified computational problems by their need for space and time
  - Problems usually defined by languages.
  - Use standard models of computation.
  - Use standard measures of space and time.
- A language  $L$  is defined as a subset of the set of strings over an alphabet,  $L \subseteq \Sigma^*$
- The complement of the language  $L$ , denoted  $\bar{L}$ , is the set  $\Sigma^* - L$



# Decision Problems

- Languages defined by **decision problems**.

## **Satisfiability (SAT)**

*Instance:* A set of literals  $X = \{x_1, \bar{x}_1, \dots, x_n, \bar{x}_n\}$  and a sequence of clauses  $C = (c_1, \dots, c_m)$  where each  $c_i$  is a subset of  $X$ .

*Answer:* “Yes” if for some assignment of values to Boolean variables  $\{x_1, \dots, x_n\}$  at least one literal in each clause has value 1.

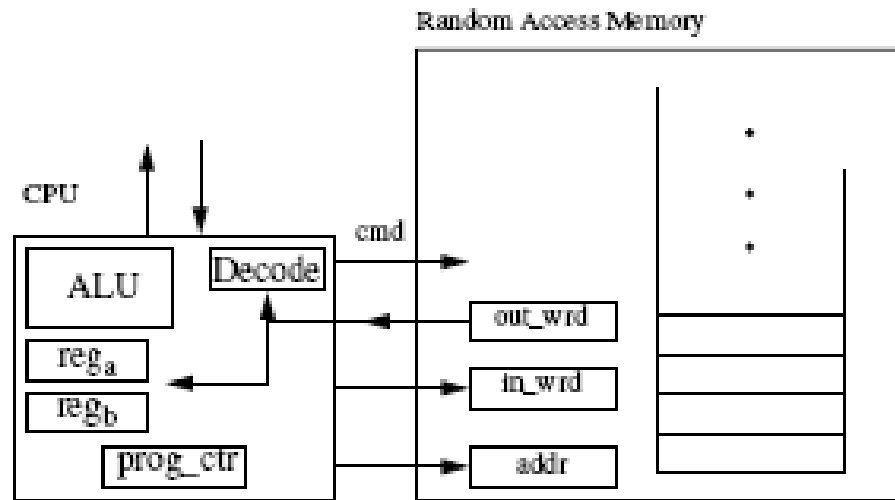


# Decision Problems

- Strings in satisfiability define a language.
- The complement of a decision problem  $P$ , denoted  $\mathbf{co-}P$ , is the set of “No” instances of a decision problem
- Note that  $\mathbf{co-}P$  is not  $\bar{P}$  because  $\mathbf{co-}P \cup P$  is the set of strings describing well-formed clauses, not all strings over  $\Sigma^*$ .

# Standard Computational Model

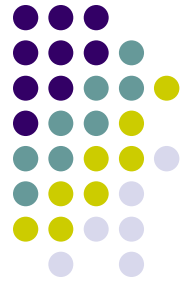
## Random Access Machine



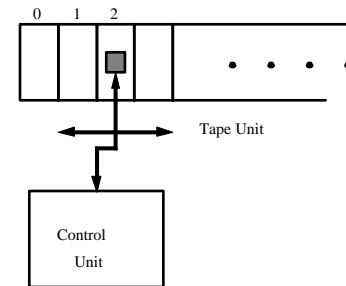
- Adds, subtracts, shift left or right one place, compare two words, perform Boolean vector AND, OR and NOT, do loads, stores, and conditional jumps and immediate and direct addressing.
- No multiplication or division allowed.
- If fixed-length addresses and fixed values are stored in memory initially, how big can addresses and values become?

# Standard Computational Model

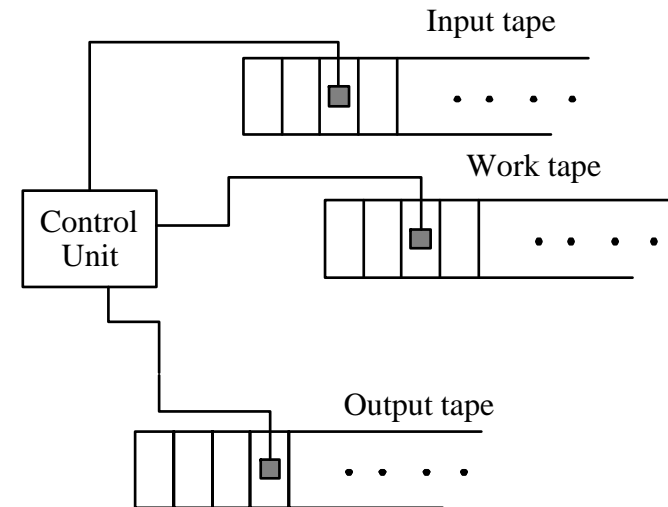
## Turing Machine



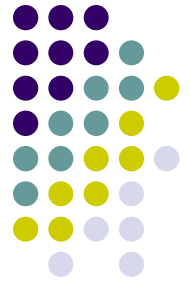
- The standard one-tape Turing Machine



- The multi-tape TM
  - When space counts, input tape is read-only & space is number of cells used on work tape.



# Standard Computational Models



- **Time** is number of steps executed. **Space** on the TM is number of tape cells used; on the RAM it is number of storage bits used.
- Time on TM and RAM can be shown to be within polynomial bounds of one another. Why is that?
  - Simulate T-step RAM on the TM.
  - Store RAM words as (*address*, *value*) pairs on the TM tape.
  - To overwrite a word, invalidate the previous pair without removing it and write a new one.
  - How many bits can each address have after T steps?
  - How long does it take to simulate a RAM step on the TM?
  - Does this imply  $O(T^3)$  time simulation?

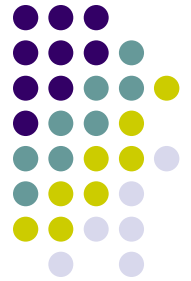


# Resource Bounds

- Typical resource functions are logarithms, polynomials of logs, linear, polynomials, super-polynomials, and exponentials.
- We must avoid functions so complex that they cannot be computed in the time and/or space they are used to define.

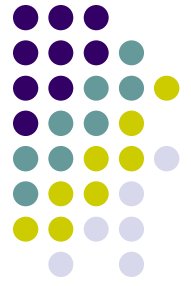
**Definition** *A function  $r: N \rightarrow N$  is **proper** if it is non-decreasing & for a letter  $a$  there is a deterministic multi-tape TM  $M$  that on all inputs of length  $n$  in time  $O(n + r(n))$  and space  $O(r(n))$  writes the string  $a^{r(n)}$  on one of its tapes and halts.*

# Proper Functions and Precise TMs



**Theorem** Let  $r(n)$  be a proper function with  $r(n) \geq n$ . Let  $M$  be a multi-tape DTM, NDTM, or oracle TM with  $k$  work tapes that computes a total function  $f$  in time or space  $r(n)$ . Then there is a constant  $K > 0$  and a precise Turing machine of the same type that computes  $f$  in time and space  $Kr(n)$ .

# Proper Functions and Precise TMs (cont.)



**Proof** Let  $M_p$  simulate in  $K_1 r(n)$  steps the machine  $M_r$  that computes  $r(n)$  to write a string of length  $r(n)$  on a special enumeration tape as well as  $K_1 r(n)$  special blank symbols on its work tapes. Since the number of tapes on  $M_p$  is finite, it uses  $kr(n)$  cells for some  $k$ .  $M_p$  alternates between writing on its tapes and reading from the enumeration tape. It continues to read once every two cycles from the enumeration tape after simulating  $M$  to insure that it uses exactly  $2r(n)$  steps.



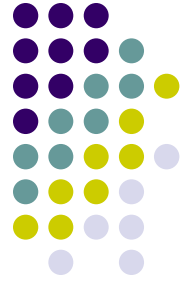
# Resource Bounds

- If  $r(n)$  is proper, a DTM  $M_r$  exists that can be used to limit a computation on an input of length  $n$  to time  $O(n + r(n))$  and space  $O(r(n))$

## **Definition A *precise multi-tape TM***

*(deterministic or not) has a proper function  $r(n)$  such that on every input of length  $n$ , it halts in precisely  $r(n)$  steps.*

# Space and Time Complexity Classes



- Deterministic and nondeterministic space and time defined for DTMs & NDTMs using proper resource functions.
- $\text{TIME}(r(n))$  and  $\text{SPACE}(r(n))$  are sets of languages accepted in  $r(n)$  deterministic time & space by DTMs
- $\text{NTIME}(r(n))$  and  $\text{NSPACE}(r(n))$  are sets of langs. accepted in  $r(n)$  nondet. time & space by NDTMs
- The classes **P** and **NP**

$$\mathbf{P} = \bigcup_k \mathbf{TIME}(n^k)$$
$$\mathbf{NP} = \bigcup_k \mathbf{NTIME}(n^k)$$

# Space and Time Complexity Classes



- Language  $L_c$  is **NP**-complete language if it is in **NP** & for any other language  $L$  in **NP** there's a poly-time computable *translation function*  $t()$  such that  $w$  is in  $L$  if and only if  $t(w)$  is in  $L_c$ . That is, the decision problem for  $L$  can be settled in poly-time by  $L_c$ .
- Exponential complexity classes

$$\text{EXPTIME} = \bigcup_n \text{TIME}(2^n)$$
$$\text{NEXPTIME} = \bigcup_n \text{NTIME}(2^n)$$



# Hierarchy Theorem

**Time Hierarchy Theorem** *If  $r(n) \geq n$  is a proper resource function, then  $\mathbf{TIME}(r(n))$  is strictly contained in  $\mathbf{TIME}(r(n) \log r(n))$ .*

- Let  $r(n)$  and  $s(n)$  be proper resource functions. Then  $r(n) = o(s(n))$  (“little oh”) if for all  $K > 0$  there exists an  $N_0$  such that  $s(n) \geq Kr(n)$  for  $n \geq N_0$ .



# Hierarchy and Gap Theorems

- **Space Hierarchy Theorem** *If  $r(n)$  and  $s(n)$  are proper resource functions and  $r(n) = o(s(n))$ , then **SPACE**( $r(n)$ ) is strictly contained in **SPACE**( $s(n)$ ).*
- **Gap Theorem** *There is a recursive function  $r(n): B^* \rightarrow B^*$  such that **TIME**( $r(n)$ ) = **TIME**( $2^{r(n)}$ )*

**Theorem:  $P \subseteq NP \subseteq EXPTIME \subseteq NEXPTIME$**   
but **P** is strictly contained in **EXPTIME**.