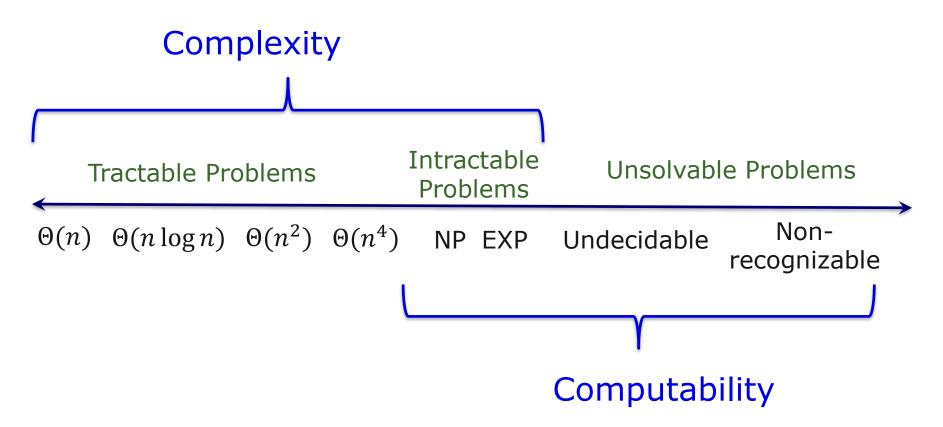
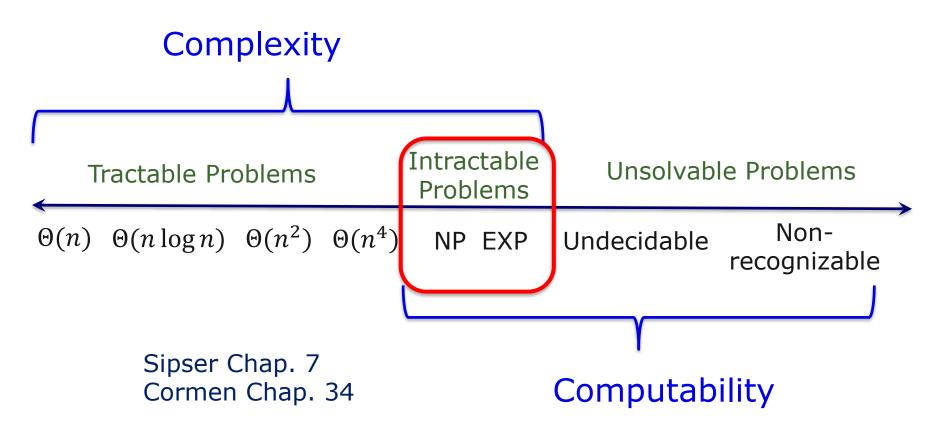
#### Course Summary...





#### Course Summary...





# Polynomial Time

- Most (all?) of the algorithms from the first part of the course run in polynomial time, e.g.,  $\Theta(n)$ ,  $\Theta(n \log n)$ ,  $\Theta(n^2)$ ,  $\Theta(n^3)$ , etc.
- Polynomial time decision problems make up the complexity class P
- If we combine and repurpose solutions that are in P, the result will also be in P



#### Nondeterministic TMs

- Nondeterministic Turing Machines (NTMs) are like normal (deterministic) Turing Machines, except that they may have multiple transition rules that can be executed at any given time
- Like NFAs, NTMs will accept as long as there is just one execution sequence that will result in an accept state (others could actually reject!)

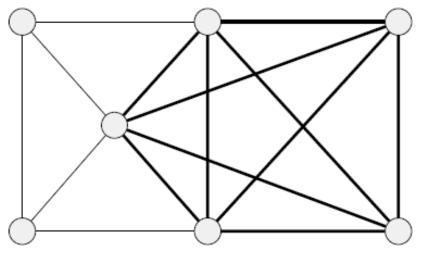


#### Nondeterminism and NP

- Computation time in an NTM is measured by how long it takes to execute a single computation path – we assume that all legal paths can be executed in parallel
- In this way, NTM computation time can be seen as the time it takes to verify that a given solution is correct for a given problem
- Problems that can be solved using nondeterministic computation in polynomial time make up the complexity class NP

### NP Problem: Clique

- Given an (undirected) graph G = (V, E), does G have a complete subgraph of k vertices?
  - A complete subgraph (aka, a clique), is where all node pairs are connected via an edge

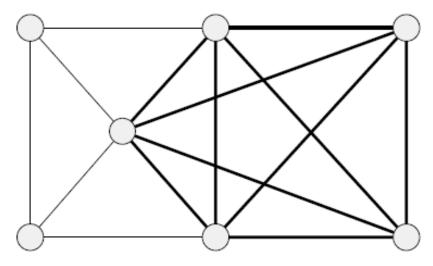




A graph with a 5-clique

### NP Problem: Clique

- There is no known (deterministic) algorithm in P that solves the clique problem
- However, we can find a nondeterministic algorithm could do so in polynomial time





A graph with a 5-clique

#### **NP Problems**

- All problems in P are also in NP, in the same way that an  $O(n^2)$  algorithm is also  $O(n^3)$ , or even  $O(2^n)$
- Open question: Is it true that  $P \neq NP$ ?
  - If you solve this, you will be the most famous living computer scientist on the planet! (And we'll give you an 'A' in the course!)



### NP Complete Problems

- A problem B is said to be NP Complete (NPC) if the following two conditions are met:
  - I. B is in NP
  - 2. Any other NP problem A can be reduced\* into the B problem
- NPC problems act as general purpose "solvers" for the class of all NP problems

#### An NPC Problem: SAT

- Given a Boolean formula  $\phi$  constructed using AND, OR, and NOT operators and several Boolean variables, is there a truth assignment to the variables that will make  $\phi$  true?
- Cook-Levin Theorem: SAT is NPC
- Proof Idea: Any NP problem can be converted into a Boolean circuit "computer" that verifies solutions for that problem



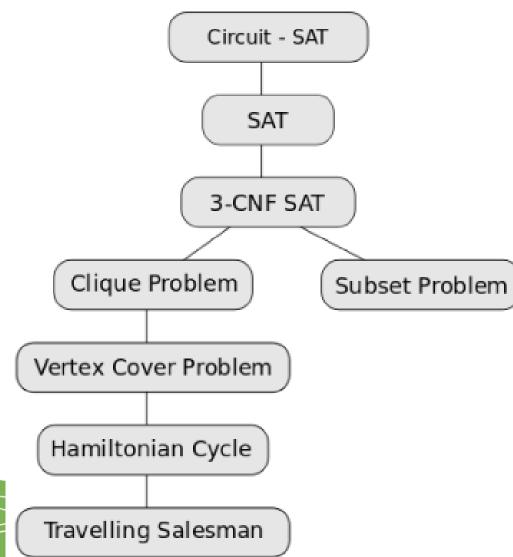
# Simple Theorem

- If we know that K is NPC, and we can reduce it to another NP problem B, then we know that B is also NPC
  - Proof: by definition of NPC, any NP problem reduces to K, and can be further reduced to B, proving B is also NPC
- This theorem is commonly used to show problems are NPC



Common Reductions Showing NP Completeness

REDUCTIONS





### Another Example: 3SAT

 Conjunctive Normal Form (CNF) is where a Boolean formula is a conjunction (ANDs) of disjunctive (OR) clauses containing literals (Boolean variables that may be NOT'ed), e.g.:

$$(x \lor \neg y \lor z) \land (y \lor \neg z) \land (w \lor \neg x \lor z)$$

- A 3CNF formula is where all of the d-clauses only have 3 literals
- The 3SAT problem is SAT, limited to 3CNF formulas

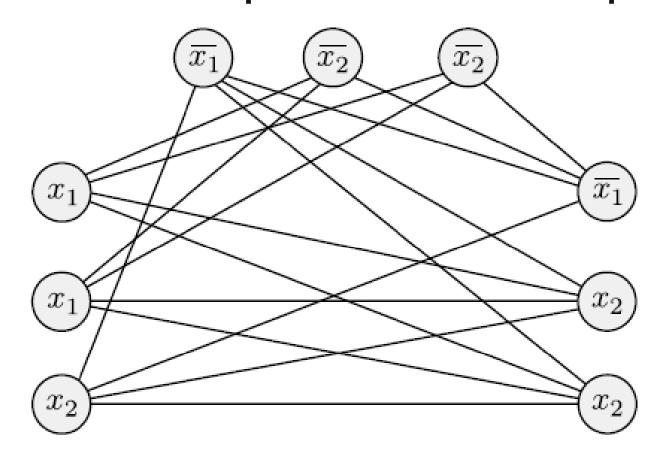


### Reduction Example: 3SAT to Clique

- Construct a graph G where:
  - Each literal in the 3CNF formula represents a node in the graph, where we group the nodes into their respective d-clauses
  - Add an edge between each pair of nodes where:
    - The nodes are not part of the same d-clause
    - One node does not represent the negation of the other



#### Reduction Example: 3SAT to Clique



#### **FIGURE 7.33**

The graph that the reduction produces from 
$$\phi = (x_1 \lor x_1 \lor x_2) \land (\overline{x_1} \lor \overline{x_2} \lor \overline{x_2}) \land (\overline{x_1} \lor x_2 \lor x_2)$$



# Reduction Example: 3SAT to Clique

- Suppose k is the number of d-clauses in our 3CNF formula
- Claim: We can find a k-clique on G iff the formula is satisfiable
- Justification:
  - A k-clique on G must contain exactly one node from each d-clause group, which represents a true literal that can make the whole d-clause true
  - A literal and its negation cannot both have nodes in the k-clique

