

Intractable Graph Optimization Problems

(4541.554 Introduction to Computer-Aided Design)

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Intractability

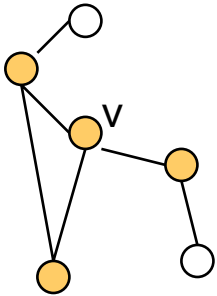
- **Problem**
 - **Optimization version**
 - Find the optimal feasible solution
 - **Evaluation version**
 - Find the cost of the optimal solution
 - Not harder than solving the optimization version
 - **Recognition version**
 - Is there a feasible solution $f \in F$ such that $c(f) \leq L$
 - Evaluate and compare the cost with L
 - Not harder than solving the evaluation version
 - **Consider recognition version only**
 - No polynomial time algorithm for recognition version
--> no polynomial time algorithm for optimization version
 - **Recognition version --> Evaluation version**
 - Binary search
 - Assume $c(f)$ is an integer and $\log c(f)$ is bounded by a polynomial in the size of the input
 - **Evaluation version --> Optimization version**
 - No known general method

- **Example:**

```

procedure MaxClique(G)    -- Returns the largest clique of G
  if G has no nodes then return null
  else
    begin
      let v be a node such that
        CliqueSize(G(v))=CliqueSize(G),
      where G(v) is the subgraph of G consisting of v and
      all of its adjacent nodes;
      return {v} ∪ MaxClique(G(v)-v);
    end

```



Complexity of CliqueSize: $C(n)$

--> Complexity of MaxClique: $T(n) \leq (n+1)C(n)+O(n)+T(n-1)$

$$= (n+1)C(n)+O(n)+nC(n-1)+O(n-1)+\dots$$

$$\leq n(n+1)C(n)+nO(n) = O(n^2C(n))$$

$$T(n) = O(n^2C(n))$$

- **Definition of P and NP**

- **P**

- Class of problems which can be solved in polynomial time by a deterministic machine

- **NP**

- Class of problems which can be solved in polynomial time by a nondeterministic machine
 - With input $x\$c(x)$, where x is a yes instance, $c(x)$ is the certificate, and $\$$ marks the end of the input, there exists a certificate checking algorithm that reaches the answer 'yes' after at most polynomial steps

- **Example of an NP problem**

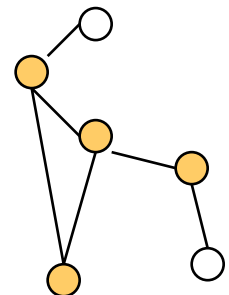
- Recognition version of the Maximum Clique problem:

Given a graph $G(V, E)$, is there a clique of size K ?

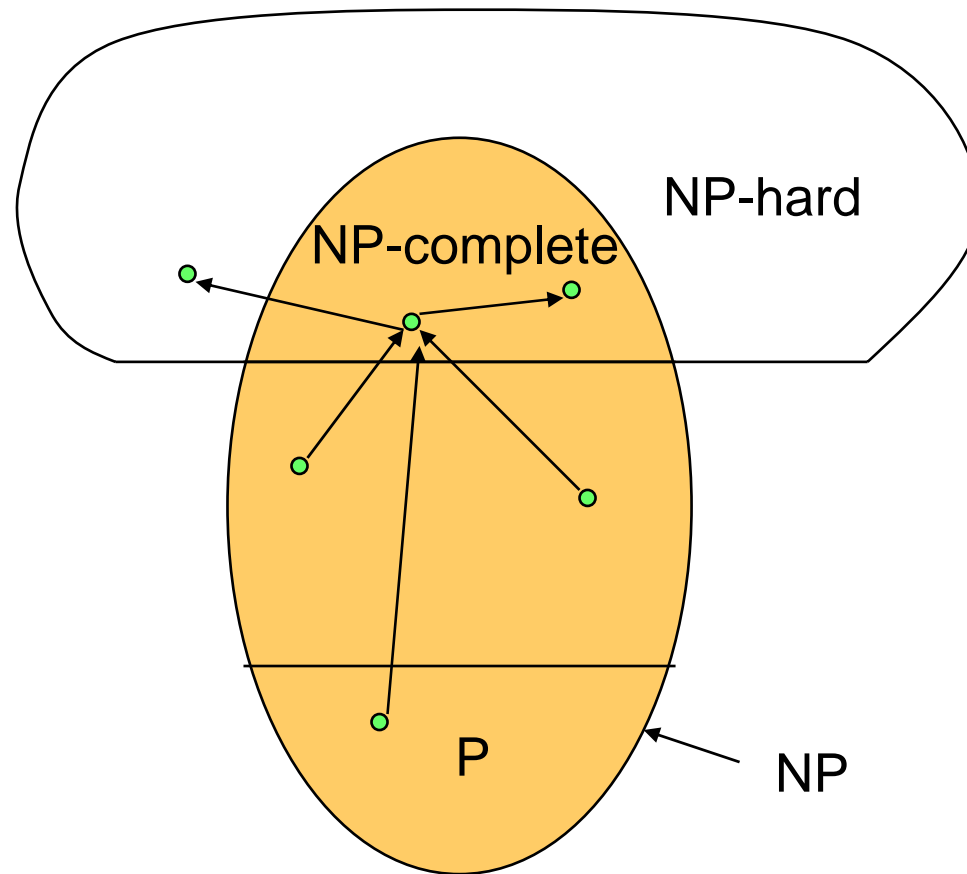
- x : graph G and integer K

$c(x)$: a set of vertices C , $|C|=K \leq p(|x|)$

- Checking whether there is an edge (u, v) in G for all $u, v \in C$ takes $O(n^2)$ steps



- **Polynomial-Time Transformation**
 - A recognition problem A_1 polynomially transforms to another recognition problem A_2 , if given x (any instance of A_1), we can construct y (an instance of A_2) within polynomial time, such that x is a yes instance of A_1 if and only if y is a yes instance of A_2
- **Definition of NP-Completeness**
 - A recognition problem $A \in \text{NP}$ is said to be NP-complete if all other problems in NP polynomially transform to A
- **Proof of NP-Completeness**
 - Prove that the given problem is in NP --- (1)
 - Then prove that all other problems in NP polynomially transform to the given problem
Or prove that a known NP-complete problem is polynomially transformable to the given problem--- (2)
 - A problem that satisfies (2) is said to be in NP-hard



S. A. Cook proved that the Satisfiability problem is NP-complete

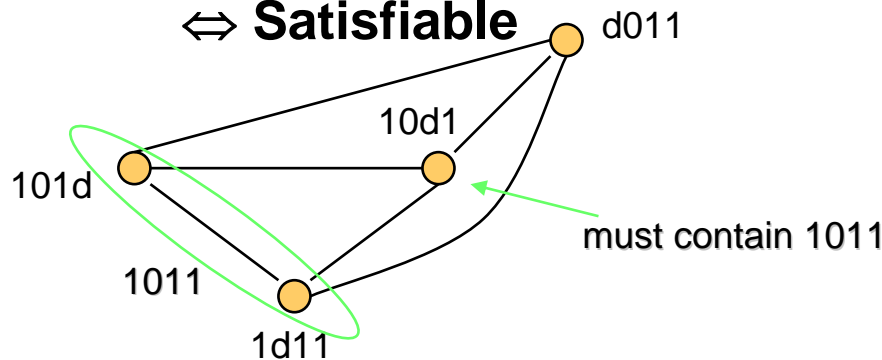
$$(x_1 + x_2' + x_3) (x_1' + x_2' + x_3)(x_2)(x_3') \dots$$

• **Example**

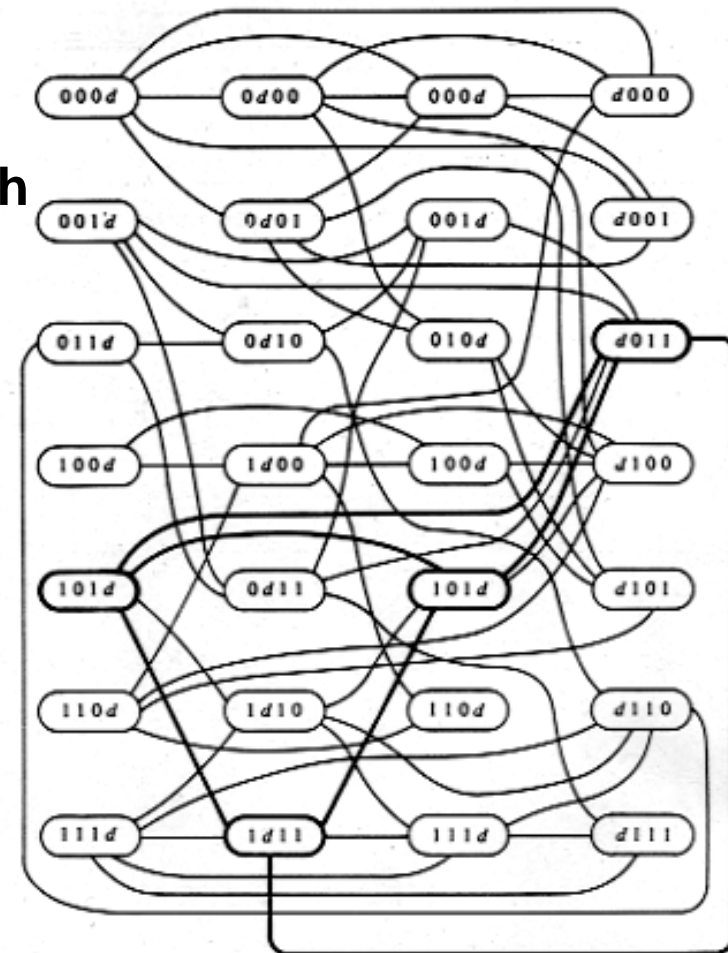
- Prove that the Clique problem is NP-complete
- Clique problem : Given a graph $G(V, E)$, is there a clique of size K ?
- Clique problem is in NP
 - previously proven
- Let's polynomially transform the 3-Satisfiability problem which is known to be NP-complete to the Clique problem

There is a clique of size K

\Leftrightarrow **Satisfiable**

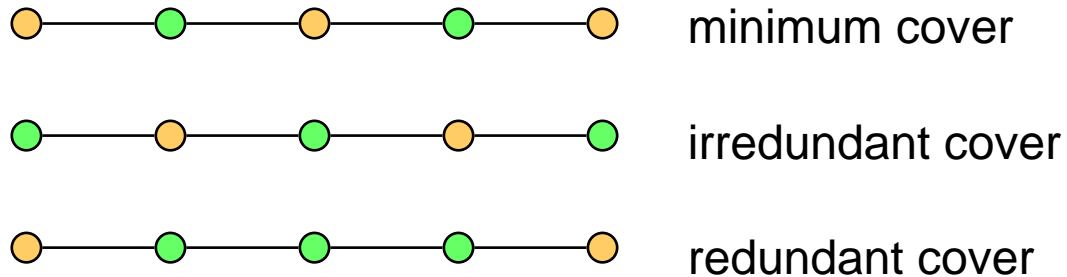


$$(x_1 + \bar{x}_2 + x_3) \cdot (\bar{x}_1 + x_3 + \bar{x}_4) \cdot (x_1 + \bar{x}_2 + \bar{x}_3) \cdot (x_2 + \bar{x}_3 + x_4)$$

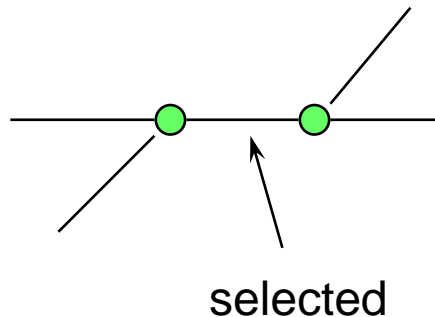


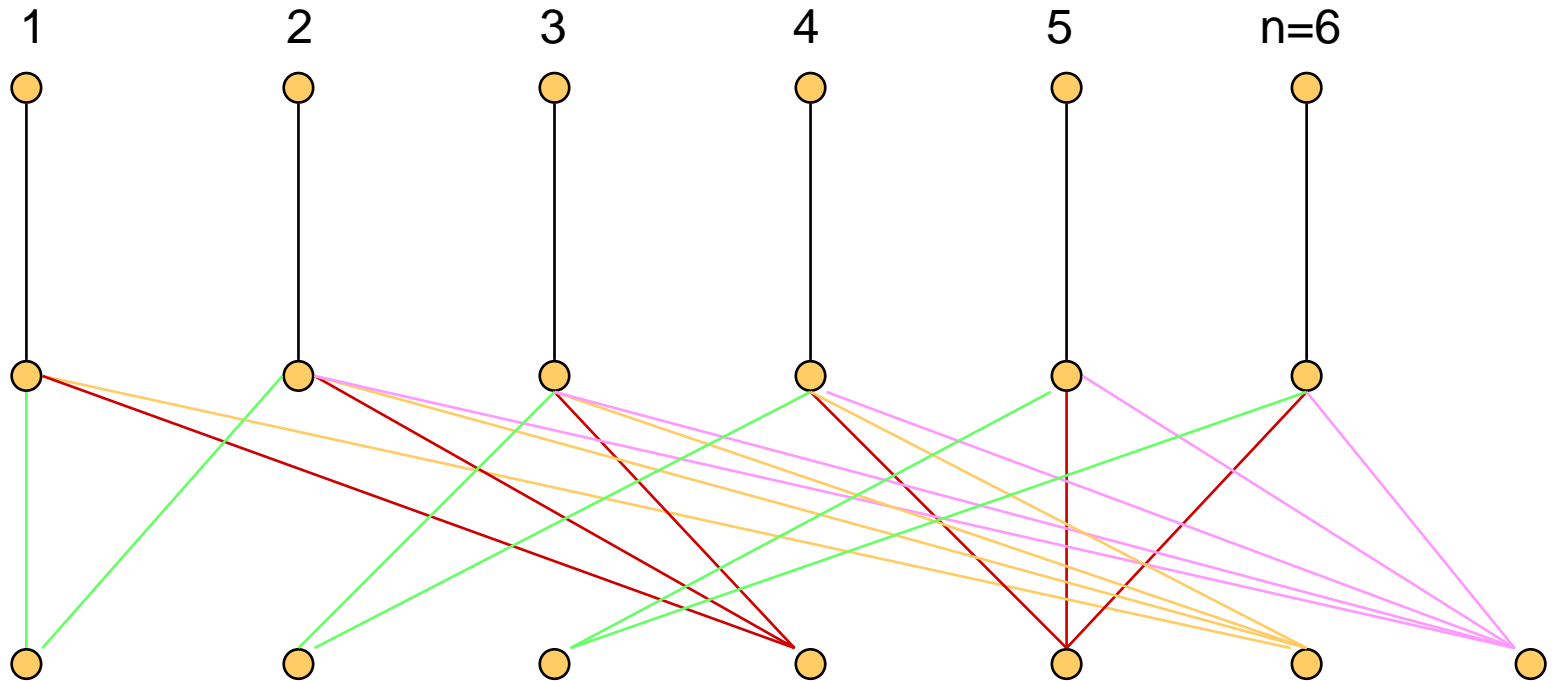
Vertex Cover

- Intractable (NP-complete)
- Greedy algorithm
 - select vertices with largest degree (possibly exceeds twice the minimum)



- select edges (at most twice the minimum)



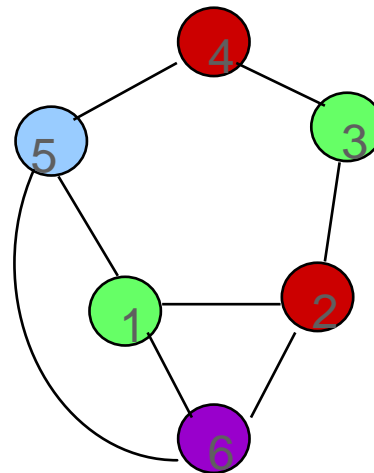
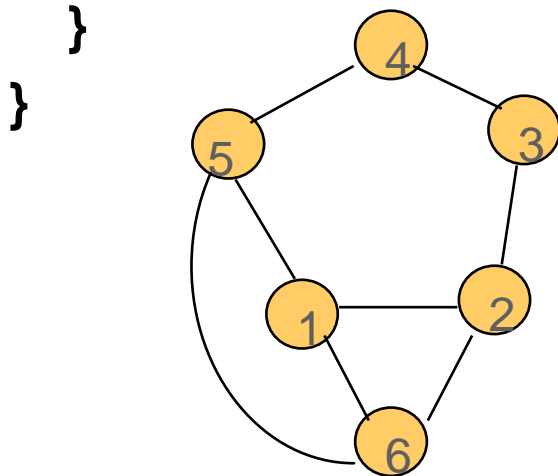


n	6	10	30	100
vertex cover /n	2.17	2.6	3.67	4.8

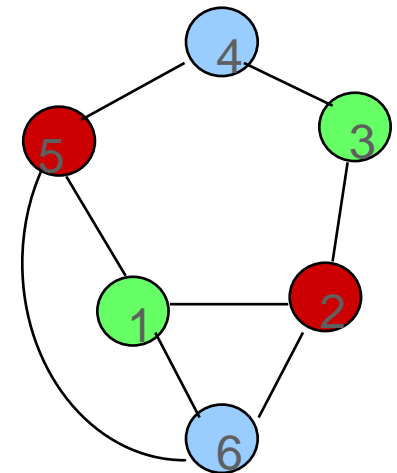
$$|\text{vertex cover}| = n + \sum_{j=2}^{n-1} \lfloor n/j \rfloor$$

Graph Coloring

- Intractable
- VERTEX_COLOR (G(V, E)) {
 - for (i = 1 to |V|) {
 - c = 1;
 - while (a vertex adjacent to v_i has color c) do {
 - c = c + 1;
 - label v_i with color c;



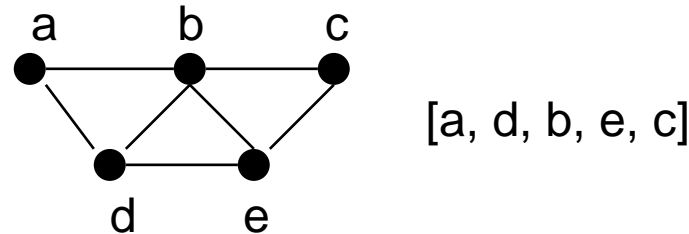
greedy



backtrack

- Chordal graph --> has perfect vertex elimination scheme
--> coloring in $O(|V| + |E|)$ time

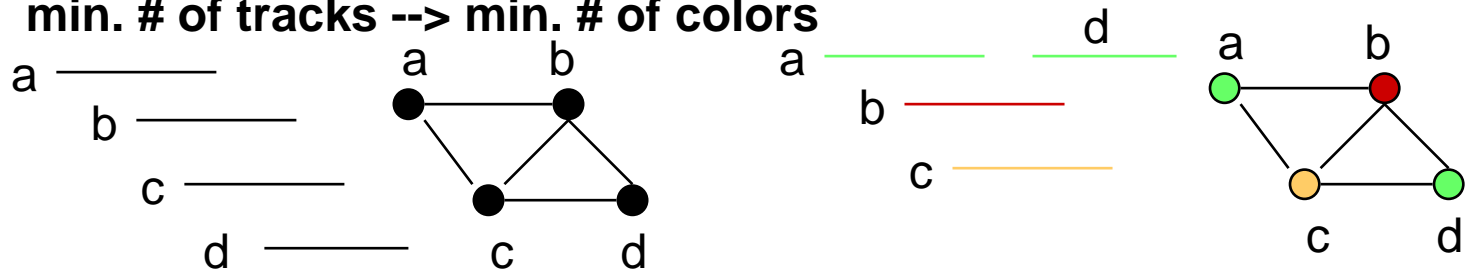
- Perfect vertex elimination scheme : An ordering of vertices $[v_1, v_2, \dots, v_n]$ such that $\{v_j \in \text{Adj}(v_i) \mid j > i\}$ is complete



- Interval graph --> chordal --> use perfect vertex elimination scheme
- When a problem is specified by a set of intervals --> use left edge algorithm --> $O(|V| \log |V|)$

- intervals in a row --> no intersection --> no edge --> same color

- min. # of tracks --> min. # of colors



– Left edge algorithm

```
LEFT_EDGE(L) {
```

```
    Sort elements in a list L in ascending order of  $l_i$ ;
```

```
        /*  $l_i$ =coordinate of left edge of element i */
```

```
    Build a heap priority queue containing only root node q such that
```

```
        track_number(q)=0 and coordinate of rightmost edge(q)=0;
```

```
        /* priority queue containing nodes, one for each track */
```

```
    n=1;                /* initialize max # of tracks */
```

```
    while (L is not empty) do {
```

```
        s=First element in L ;
```

```
        if ( $l_s \geq r_{\min}$ ) {                /*  $r_{\min}$ =coordinate of root in the queue */
```

```
            assign s to track of the root;
```

```
            update priority queue;
```

```
        }
```

```
        else {
```

```
            n=n+1;                /* add a new track */
```

```
            assign s to track n;
```

```
            update priority queue with a new node;
```

```
        }
```

```
    }
```

```
}
```

– **Complexity:**

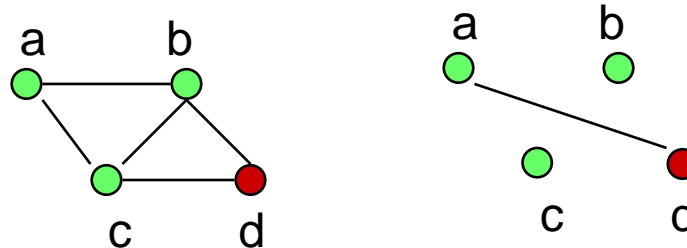
- **Sorting: $O(|V|\log|V|)$**
- **If the elements sorted are in a limited range, we can use linear time sorting techniques such as radix sort (may be less efficient due to high constant).**
 - > complexity becomes $O(|V|\log(d))$, where d is the density**
 - > can be reduced further down to linear time**

– **Proof of optimality**

- **Assuming density d , lower bound of the number of tracks required is d .**
- **So it is sufficient to prove that the left edge algorithm always places all intervals on d tracks, which is optimum.**
- **Now, assume the left edge algorithm does not give the optimum. That is, during the run of the algorithm, an interval cannot be assigned to any of the d tracks. This implies that the density is $d+1$, which is a contradiction.**

Clique Partitioning

- Intractable
- Clique partitioning \leftrightarrow coloring the complement
 - clique \leftrightarrow independent set in the complement
 - find max. clique \leftrightarrow find max. independent set in the complement
 - vertices not in a vertex cover \rightarrow no edge between any pair of these vertices \rightarrow independent set



- Can be solved in $O(|V|+|E|)$ for chordal graph using perfect vertex elimination scheme
- Can be solved in polynomial time for comparability graph by transforming it into a minimum network flow problem