



DS-210: PROGRAMMING FOR DATA SCIENCE

LECTURE 25

1. REPRESENTING GRAPHS: EXAMPLES IN RUST

2. SAMPLE GRAPH ALGORITHMS

3. MODULES





DISCUSSION SECTION TODAY

- Reading input from file
 - You'll be asked to do this on your homework
- Additional examples of using collections





1. REPRESENTING GRAPHS: EXAMPLES IN RUST

2. SAMPLE GRAPH ALGORITHMS

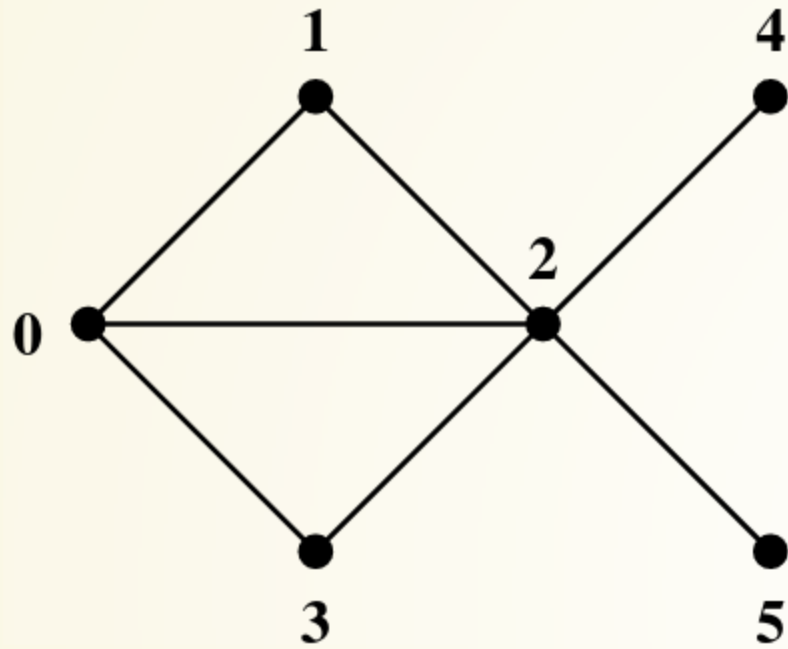
3. MODULES





SAMPLE GRAPH

Sample graph from the previous lecture:



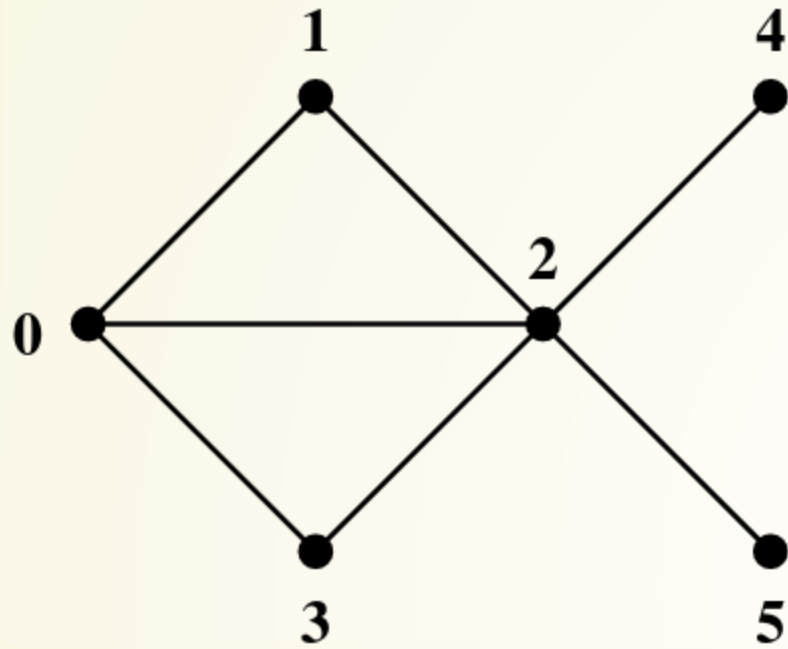
This lecture's graphs:

- undirected
- no self-loops
 - self-loop: edge connecting a vertex to itself
- no parallel edges (connecting the same pair of vertices)



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Simplifying assumption:

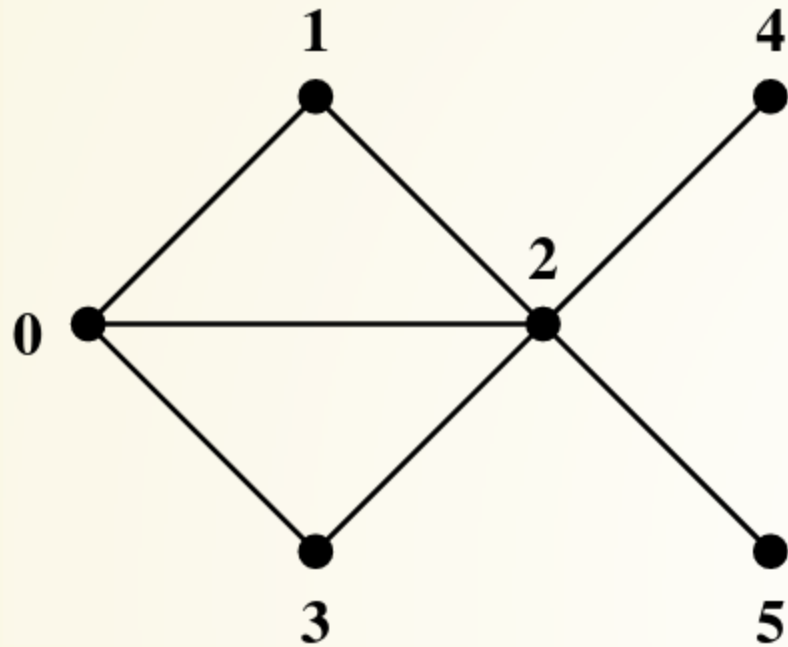
- n vertices labeled $0 \dots n - 1$





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Sample graph from the previous lecture:



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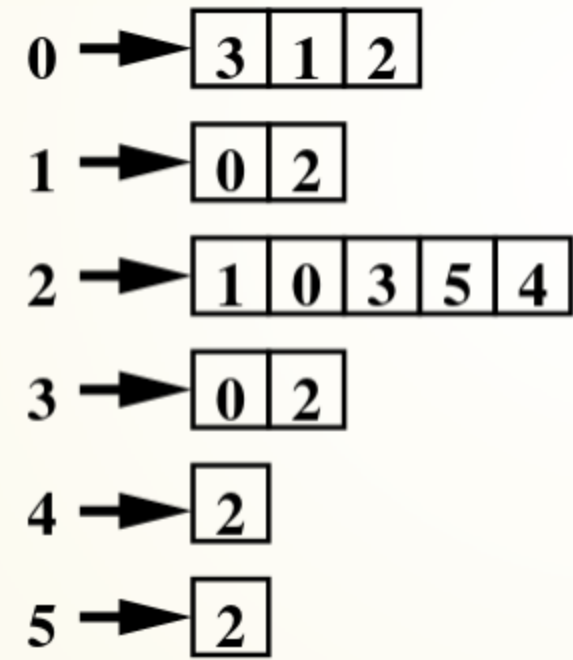
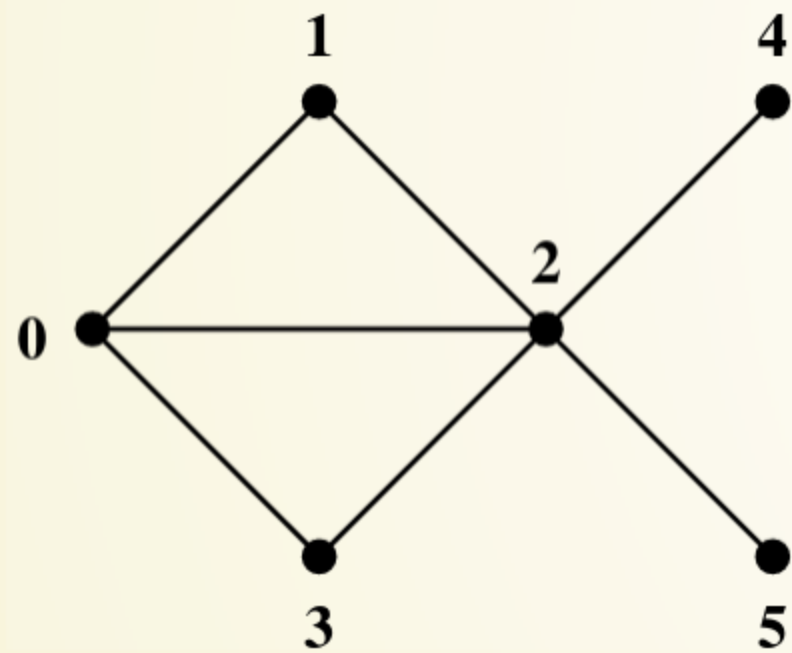
```
In [2]: // number of vertices
let n : usize = 6;

// list of edges
let edges : Vec<(usize,usize)> = vec![(0,1), (1,2), (2,3), (3,0), (2,0), (2,4), (2,5)];
```



ADJACENCY LIST REPRESENTATION

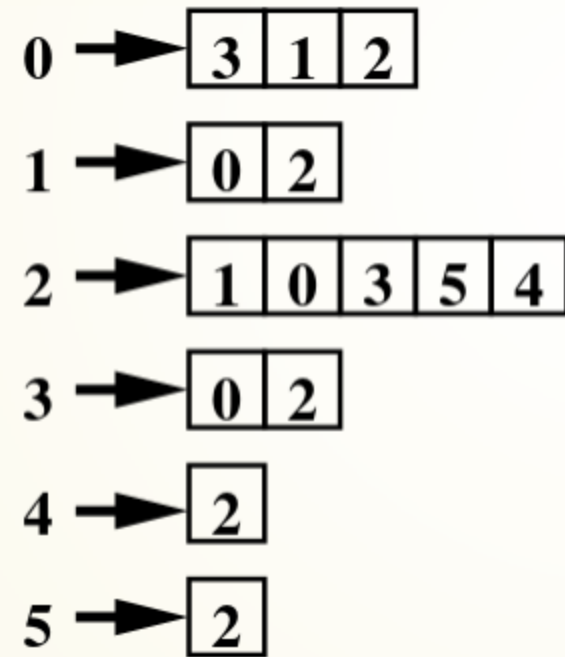
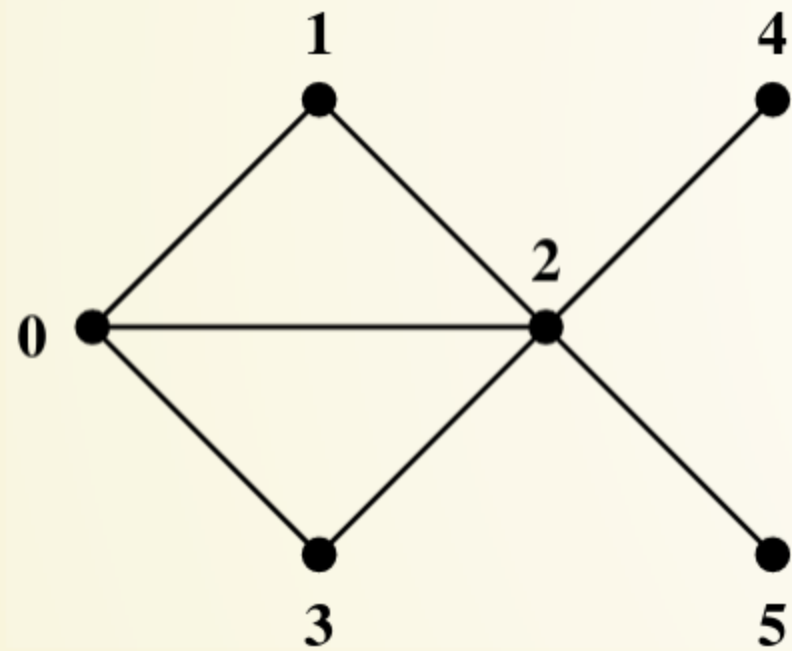
List of neighbors for each vertex





ADJACENCY LIST REPRESENTATION

List of neighbors for each vertex



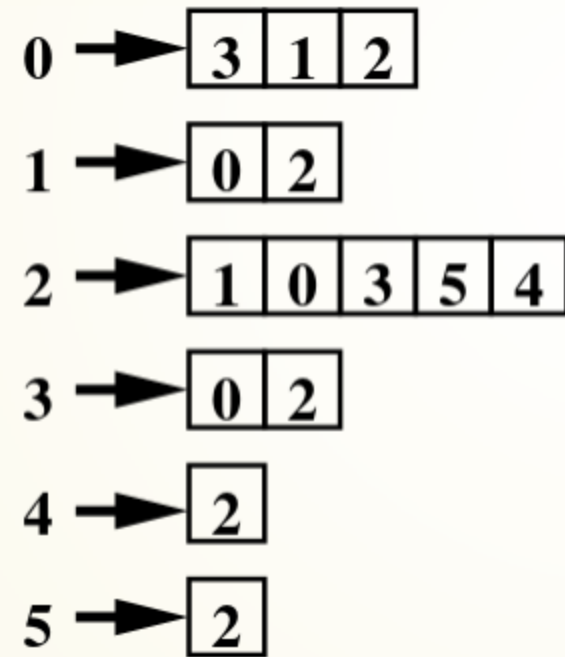
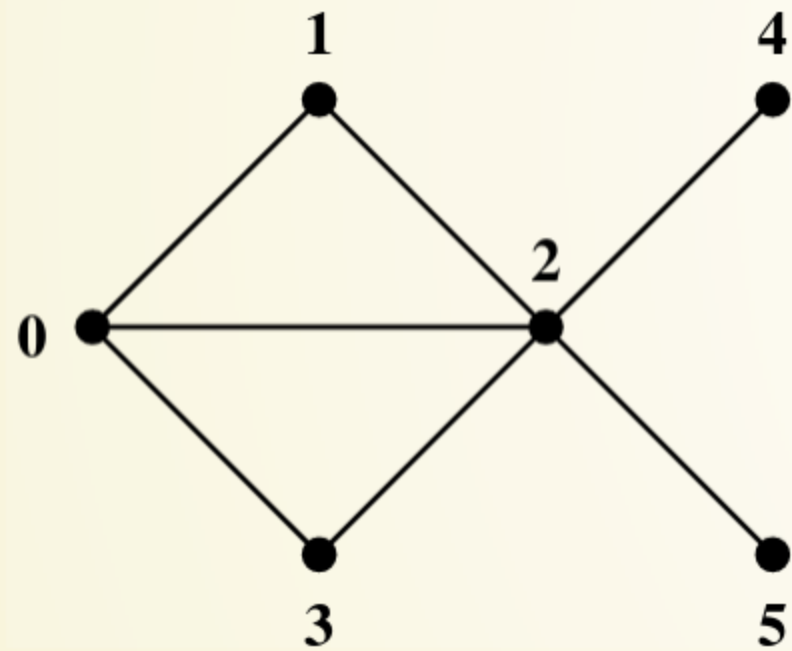
```
In [3]: let mut graph_list : Vec<Vec<usize>> = vec![vec![];n];
```





ADJACENCY LIST REPRESENTATION

List of neighbors for each vertex



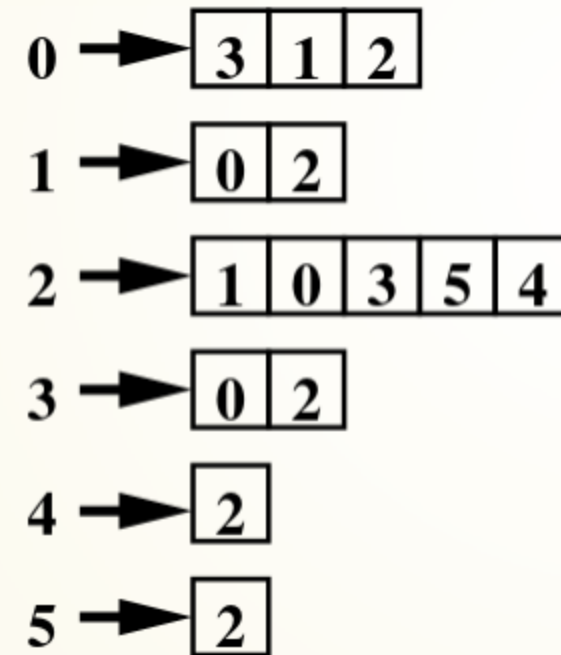
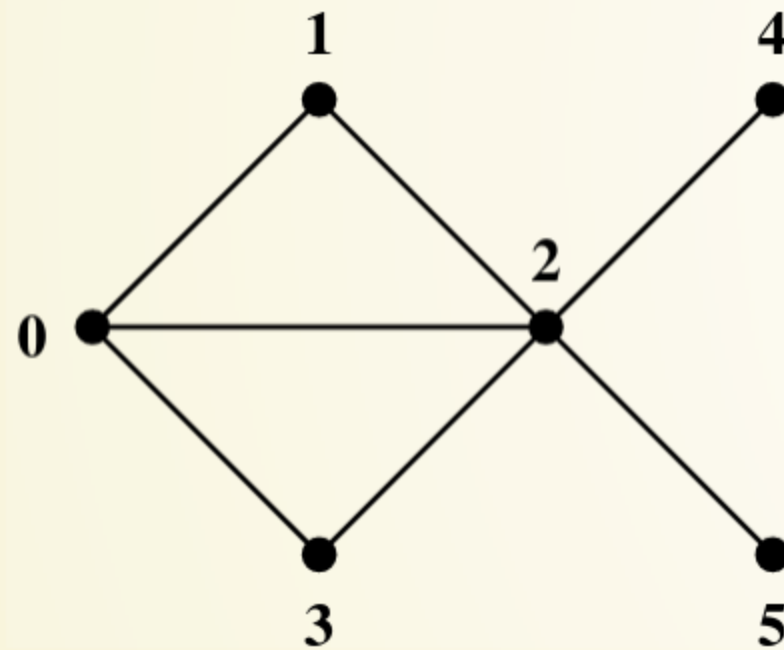
```
In [3]: let mut graph_list : Vec<Vec<usize>> = vec![vec![];n];
```

```
In [4]: for (v,w) in edges.iter() {  
        graph_list[*v].push(*w);  
        graph_list[*w].push(*v);  
};
```



ADJACENCY LIST REPRESENTATION

List of neighbors for each vertex



```
In [3]: let mut graph_list : Vec<Vec<usize>> = vec![vec![];n];
```

```
In [4]: for (v,w) in edges.iter() {  
    graph_list[*v].push(*w);  
    graph_list[*w].push(*v);  
};
```

```
In [5]: for i in 0..graph_list.len() {  
    println!("{}", i, graph_list[i]);  
};
```

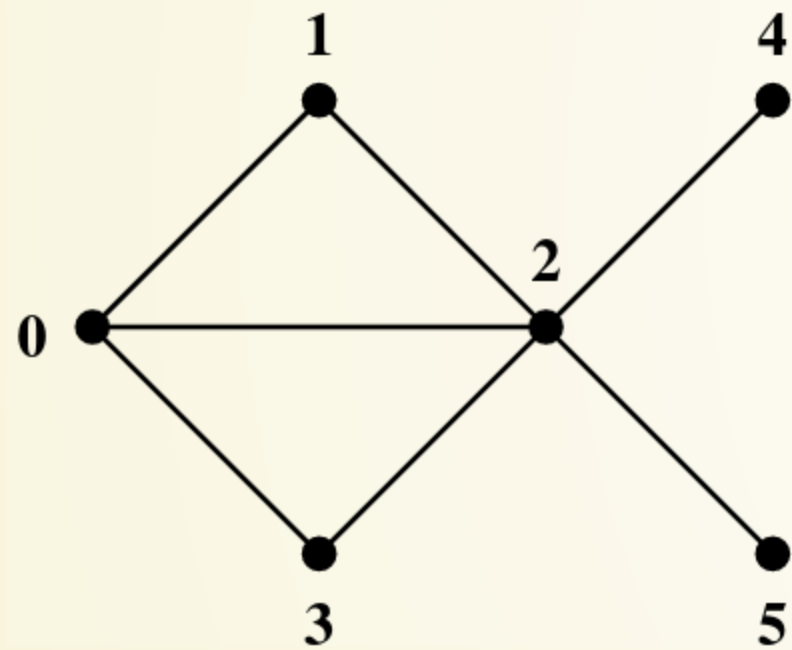
```
0: [1, 3, 2]  
1: [0, 2]  
2: [1, 3, 0, 4, 5]  
3: [2, 0]  
4: [2]  
5: [2]
```





ADJACENCY MATRIX REPRESENTATION

Matrix of Boolean values



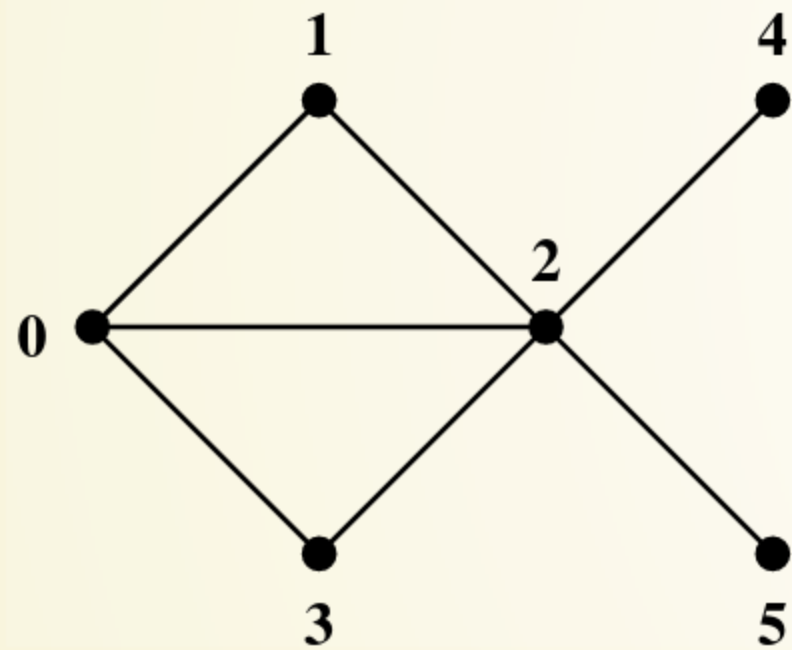
	0	1	2	3	4	5
0		1	1	1	0	0
1	1		1	0	0	0
2	1	1		1	1	1
3	1	0	1		0	0
4	0	0	1	0		0
5	0	0	1	0	0	





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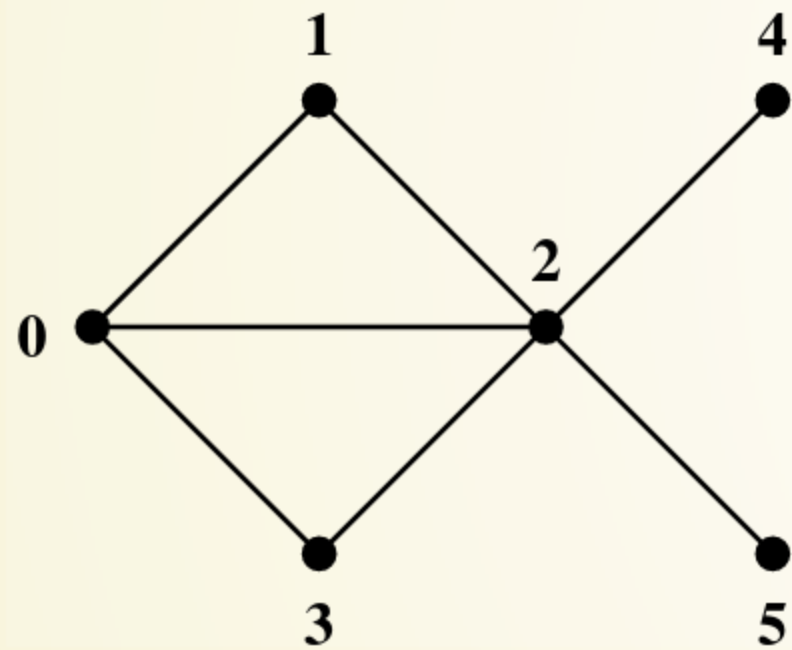
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```
In [6]: let mut graph_matrix = vec![vec![false;n];n];
```



ADJACENCY MATRIX REPRESENTATION

Matrix of Boolean values



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In [6]: let mut graph_matrix = vec![vec![false;n];n];
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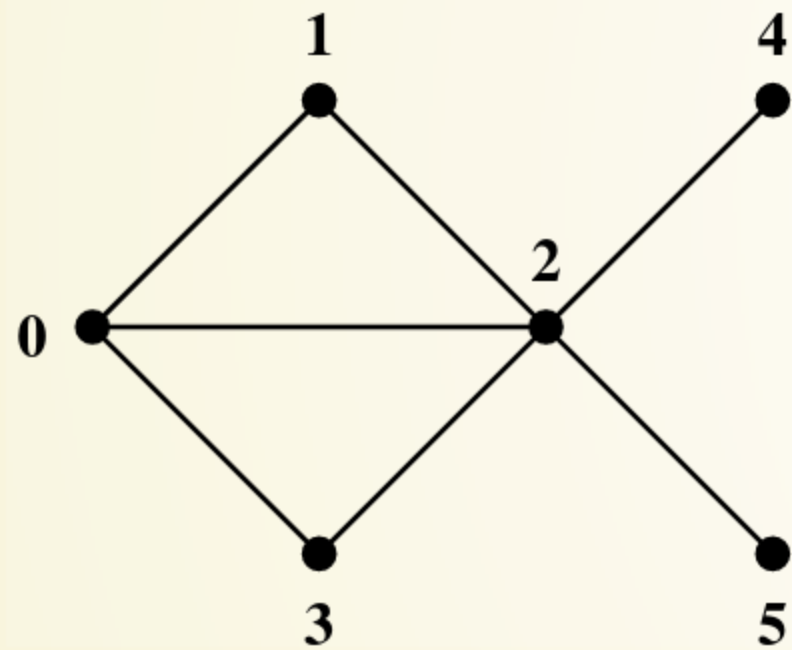
```
In [7]: for (v,w) in edges.iter() {  
    graph_matrix[*v][*w] = true;  
    graph_matrix[*w][*v] = true;  
};
```





ADJACENCY MATRIX REPRESENTATION

Matrix of Boolean values



	0	1	2	3	4	5
0		1	1	1	0	0
1	1		1	0	0	0
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4	0	0	1	0		0
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```
In [6]: let mut graph_matrix = vec![vec![false;n];n];
```

```
In [7]: for (v,w) in edges.iter() {  
    graph_matrix[*v][*w] = true;  
    graph_matrix[*w][*v] = true;  
};
```

```
In [8]: for row in &graph_matrix {  
    for entry in row.iter() {  
        print!("{}",if *entry {"1"} else {"0"});  
    }  
    println!("");  
};
```

```
011100  
101000  
110111  
101000  
001000  
001000
```





WHAT IF LABELS ARE NOT IN $\{0, 1, \dots, n - 1\}$?

T = type of labels





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Solution 1: Map everything to this range

- Create hash maps from input labels to $\{0, 1, \dots, n - 1\}$
- Create a reverse hash map to recover labels when needed





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T = type of labels

Solution 1: Map everything to this range

- Create hash maps from input labels to $\{0, 1, \dots, n - 1\}$
- Create a reverse hash map to recover labels when needed

Solution 2: Replace with hash maps and hash sets

- Adjacency lists: use `HashMap<T, Vec<T>>`
- Adjacency matrix: use `HashSet<(T, T)>`
- Bonus gain: `HashSet<(T, T)>` better than adjacency matrix for sparse graphs





WHAT IF THE GRAPH IS DIRECTED?





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- separate lists incoming/outgoing edges
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Adjacency matrix:

- example: edge $u \rightarrow v$ and no edge in the opposite direction:
 - `matrix[u][v] = true`
 - `matrix[v][u] = false`





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COUNT TRIANGLES

Problem to solve: Consider all triples of vertices. What is the number of those in which all vertices are connected?





COUNT TRIANGLES

Problem to solve: Consider all triples of vertices. What is the number of those in which all vertices are connected?

Solution 1: Enumerate explicitly over all triples and check which are triangles, using the adjacency matrix

```
In [9]: let mut count: u32 = 0;
        for u in 0..n {
            for v in u+1..n {
                for w in v+1..n {
                    if (graph_matrix[u][v] && graph_matrix[v][w] && graph_matrix[u][w]) {
                        count += 1;
                    }
                }
            }
        }
        count
```

Out[9]: 2





COUNT TRIANGLES

Problem to solve: Consider all triples of vertices. What is the number of those in which all vertices are connected?

Solution 2: Follow links from each vertex to see if you come back in three steps

```
In [10]: let mut count: u32 = 0;
         for u in 0..n {
           for v in &graph_list[u] {
             for w in &graph_list[*v] {
               for u2 in &graph_list[*w] {
                 if u == *u2 {
                   count += 1;
                 }
               }
             }
           }
         }
         count
```

Out[10]: 12





COUNT TRIANGLES

Problem to solve: Consider all triples of vertices. What is the number of those in which all vertices are connected?

Solution 2: Follow links from each vertex to see if you come back in three steps

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               for u2 in &graph_list[*w] {
                 if u == *u2 {
                   count += 1;
                 }
               }
             }
           }
         }
         count
```

Out[10]: 12

```
In [11]: // need to divide by 6
         // due to symmetries triangles counted multiple times
         count / 6
```

Out[11]: 2





COUNT TRIANGLES

Problem to solve: Consider all triples of vertices. What is the number of those in which all vertices are connected?

Different implementation of solution 2

```
In [12]: fn walk(current:usize,destination:usize,steps:usize,adjacency_list:&Vec<Vec<usize>>) -> u32 {
    match steps {
        0 => if current == destination {1} else {0},
        _ => {
            let mut count = 0;
            for v in &adjacency_list[current] {
                count += walk(*v,destination,steps-1,adjacency_list);
            }
            count
        }
    }
}
```





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    match steps {
        0 => if current == destination {1} else {0},
        _ => {
            let mut count = 0;
            for v in &adjacency_list[current] {
                count += walk(*v,destination,steps-1,adjacency_list);
            }
            count
        }
    }
}
```

```
In [13]: let mut count = 0;
for v in 0..n {
    count += walk(v,v,3,&graph_list);
}
count / 6
```

Out[13]: 2





COUNT TRIANGLES

Problem to solve: Consider all triples of vertices. What is the number of those in which all vertices are connected?

Solution 3: For each vertex try all pairs of neighbors (via adjacency lists) and see if they are connected (via adjacency matrix)

```
In [14]: let mut count: u32 = 0;
         for u in 0..n {
           let neighbors = &graph_list[u];
           for v in neighbors {
             for u in neighbors {
               if graph_matrix[*v][*u] {
                 count += 1;
               }
             }
           }
         }
         count / 6
```

Out[14]: 2





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MODULES

Up to now: **our** functions and data types (mostly) in the same namespace

- **exception:** functions in structs and enums





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- **exception:** functions in structs and enums

One can create a namespace, using `mod`

```
In [15]: mod things_to_say {  
    fn say_hi() {  
        say("Hi");  
    }  
  
    fn say_bye() {  
        say("Bye");  
    }  
  
    fn say(what: &str) {  
        println!("{}", what);  
    }  
}
```





MODULES

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    fn say(what: &str) {  
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    }  
}
```

You have to use the module name to refer to access a function.

```
In [16]: things_to_say::say_hi();  
  
things_to_say::say_hi();  
           ^^^^^^ private function  
function `say_hi` is private
```





MODULES

- By default, all definitions in the namespace are private.
- Advantage: Can hide all internally used code
- Use `pub` to make functions or types public

```
In [17]: mod things_to_say {  
    pub fn say_hi() {  
        say("Hi");  
    }  
  
    pub fn say_bye() {  
        say("Bye");  
    }  
  
    fn say(what: &str) {  
        println!("{}", what);  
    }  
}
```

```
In [18]: things_to_say::say_hi();  
Hi!
```



TO BE CONTINUED...

