

BGL Introduction

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Some of the material by:

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What is BGL?

- Library of graph algorithms
- Solve problems using graphs without having to implement standard algorithms
- Documentation is available on <https://algotlab.inf.ethz.ch/doc/>.

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Roadmap

- **BGL Introduction**
- Flows
- Advanced flows

Declaring Graphs in BGL

Examples of standard graph algorithms in BGL

Tutorial Problem

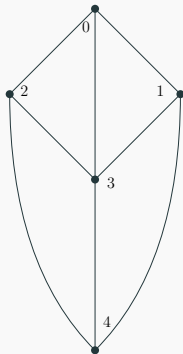
Overview

Graph definition

We represent a graph $G = (V, E)$ as an **adjacency list**. G has **n** vertices and **m** edges.

Space $O(n + m)$

Vertex	List of neighbors
0	[1, 2, 3]
1	[0, 3, 4]
2	[0, 3, 4]
3	[0, 1, 2, 4]
4	[1, 2, 3]



STL vs BGL

C++ Standard Library

```
#include <vector>
```

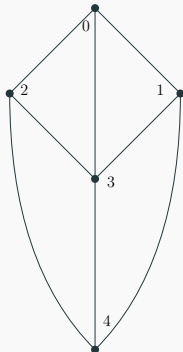
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```
typedef std::vector<neighbor_list>  cpp_graph;
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BGL

```
#include <boost/graph/adjacency_list.hpp>
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typedef boost::adjacency_list<boost::vecS,  
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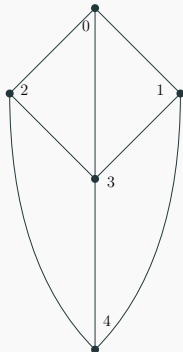
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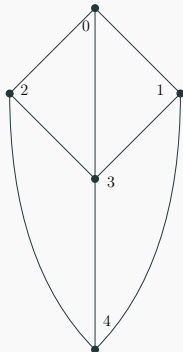
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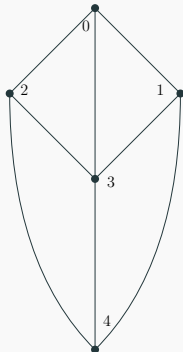
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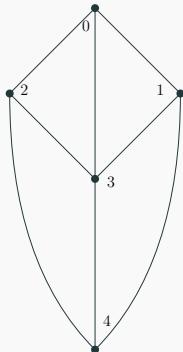
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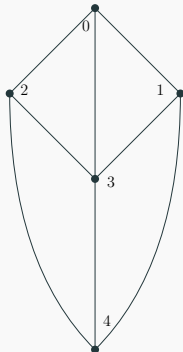
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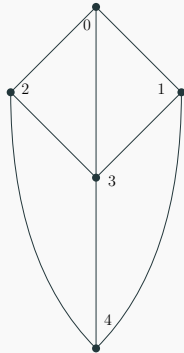
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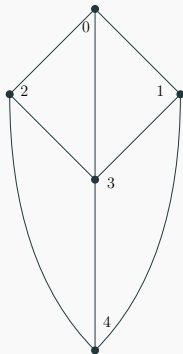
Initializing the graph

```
void init_graph(){  
    graph G(5);  
  
    boost::add_edge(0, 1, G);  
    boost::add_edge(0, 2, G);  
    boost::add_edge(0, 3, G);  
    boost::add_edge(1, 3, G);  
    boost::add_edge(1, 4, G);  
    boost::add_edge(2, 3, G);  
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}
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    boost::add_edge(2, 3, G);  
    boost::add_edge(2, 4, G);  
    boost::add_edge(3, 4, G);  
  
}
```



Warning!

`boost::add_edge(0, 7, G);` would extend the vertex set of `G` to eight vertices!

Iterate over the Edges

all edges:

```
typedef boost::graph_traits<graph>::edge_iterator edge_it;
```

```
edge_it e_beg, e_end;
```

```
for (boost::tie(e_beg, e_end) = boost::edges(G); e_beg != e_end; ++e_beg) {  
    std::cout << boost::source(*e_beg, G) << " "  
               << boost::target(*e_beg, G) << "\n";}
```

Warning: Be careful with iterators when removing edges!

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neighbors of a vertex:

```
typedef boost::graph_traits<graph>::out_edge_iterator out_edge_it;
```

```
out_edge_it oe_beg, oe_end;
```

```
for (boost::tie(oe_beg, oe_end) = boost::out_edges(0, G);  
     oe_beg != oe_end; ++oe_beg) {  
    assert(boost::source(*oe_beg, G) == 0);  
    std::cout << boost::target(*oe_beg, G) << "\n";}
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typedef boost::graph_traits<graph>::edge_iterator edge_it;
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```

For G undirected, `out_edges` is all incident edges.

Other graphs types

Directed graphs

```
typedef boost::adjacency_list<boost::vecS,  
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Weighted graphs

```
typedef boost::adjacency_list<  
    boost::vecS,  
    boost::vecS,  
    boost::directedS,  
    boost::no_property, // no vertex property  
    boost::property<boost::edge_weight_t, int> // edge property (interior)  
    > weighted_graph;
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Predefined Vertex and Edge Properties

Some predefined vertex and edge properties:

- `vertex_degree_t`
- `vertex_name_t`
- `vertex_distance_t`
- `edge_weight_t`
- `edge_capacity_t`
- `edge_residual_capacity_t`
- `edge_reverse_t`

All property maps must be initialized and maintained **manually!**

Declaring Graphs in BGL

Examples of standard graph algorithms in BGL

Tutorial Problem

Overview

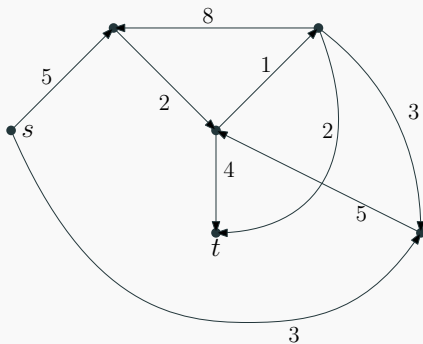
Examples of standard graph algorithms in BGL

1. Shortest path using Dijkstra's Algorithm
2. Minimum spanning tree using Kruskal's Algorithm
3. Maximum matching using Edmond's Algorithm
4. Strongly connected components using Tarjan's Algorithm

Problem: shortest path between two vertices

Input: a directed, weighted graph $G = (V, E)$, vertices $s, t \in V$

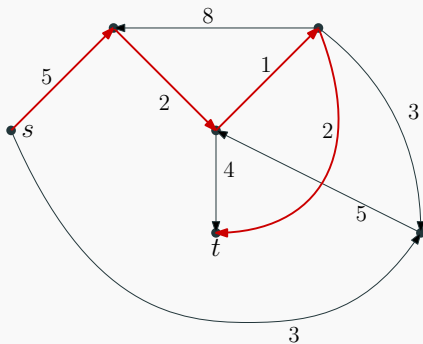
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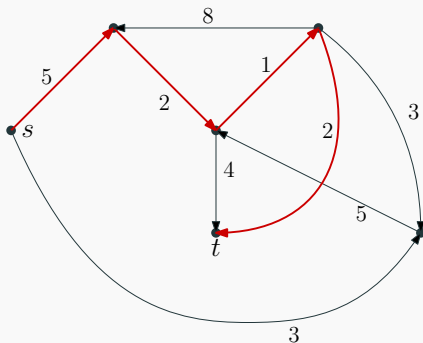
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Output: distance between s and t



Recall: Dijkstra's algorithm is one to all

Distance between Two Vertices: Dijkstra's Algorithm

```
#include <boost/graph/dijkstra_shortest_paths.hpp>

int dijkstra_dist(const weighted_graph &G, int s, int t) {
    int n = boost::num_vertices(G);
    std::vector<int> dist_map(n); //exterior property

    boost::dijkstra_shortest_paths(G, s,
        boost::distance_map(boost::make_iterator_property_map(dist_map.begin(),
            boost::get(boost::vertex_index, G))));

    return dist_map[t];
}
```

Time complexity of `boost::dijkstra_shortest_paths` is $O(n \log n + m)$

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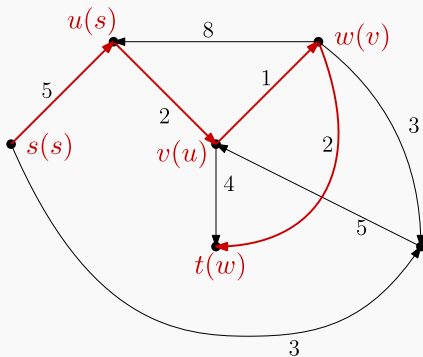
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Reconstructing the path

What if we also want to keep track of the path?

→remember for each vertex the "previous step"



Reconstructing the path

```
typedef boost::graph_traits<weighted_graph>::vertex_descriptor vertex_desc;
```

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int dijkstra_path(const weighted_graph &G, int s, int t,
                  std::vector<vertex_desc> &path) {
    int n = boost::num_vertices(G);
    std::vector<int> dist_map(n); std::vector<vertex_desc> pred_map(n);

    boost::dijkstra_shortest_paths(G, s,
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        boost::get(boost::vertex_index, G)))
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    int cur = t;
    path.clear(); path.push_back(cur);
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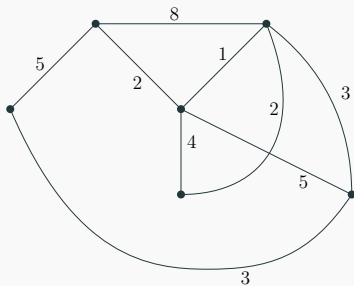
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Problem: Minimum Spanning Tree

Input: a connected, undirected, weighted graph $G = (V, E)$

Output: an edge set $E' \subseteq E$ that forms the **minimum spanning tree**:

an acyclic subgraph of G connecting all vertices in V and having the minimum sum of edge weights

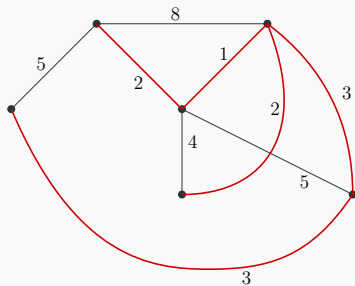


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Works with negative weights.

Minimum Spanning Tree: Kruskal's Algorithm

```
#include <boost/graph/kruskal_min_spanning_tree.hpp>
```

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typedef boost::adjacency_list<boost::vecS, boost::vecS, boost::undirectedS,  
                             boost::no_property,  
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                             > weighted_graph;
```

```
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```

```
void kruskal(const weighted_graph &G) {  
    std::vector<edge_desc> mst;    // vector to store MST edges (not a property map!)  
  
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Time complexity of `boost::kruskal_minimum_spanning_tree` is $O(m \log m)$.

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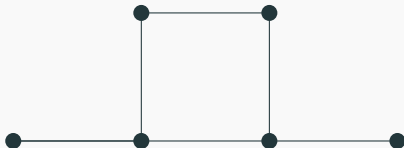
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```

Time complexity of `boost::kruskal_minimum_spanning_tree` is $O(m \log m)$. Uses **Union Find** data structure - also available in boost

Problem: Maximum matching

Input: an undirected unweighted graph $G = (V, E)$

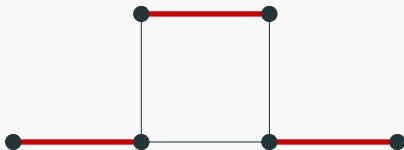
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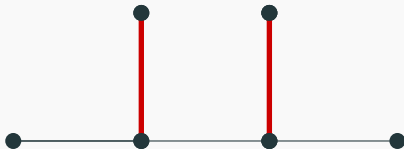


Maximum (perfect) matching in G

Problem: Maximum matching

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Output: a set of edges $M \subseteq E$ such that $|M|$ is maximum and no two edges in M share any endpoint.

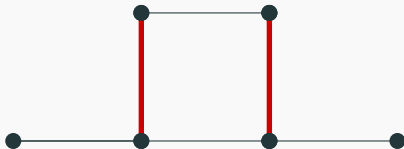


not every graph has a perfect matching

Problem: Maximum matching

Input: an undirected unweighted graph $G = (V, E)$

Output: a set of edges $M \subseteq E$ such that $|M|$ is maximum and no two edges in M share any endpoint.



Warning! Greedy may fail: a maximal matching is not always maximum

Maximum Matching: Edmond's Algorithm

```
#include <boost/graph/max_cardinality_matching.hpp>
```

```
void maximum_matching(const graph &G) {  
    int n = boost::num_vertices(G);  
    std::vector<vertex_desc> mate_map(n); // exterior property map  
    const vertex_desc NULL_VERTEX = boost::graph_traits<graph>::null_vertex();  
  
    boost::edmonds_maximum_cardinality_matching(G,  
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    int matching_size = boost::matching_size(G,  
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    for (int i = 0; i < n; ++i) {  
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Time complexity of

`boost::edmonds_maximum_cardinality_matching` is

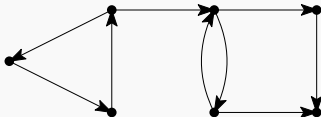
$O(mn \cdot \alpha(m, n))$ (Remember: $\alpha(m, n) \leq 4$).

Problem: Strongly Connected Components

A **strongly connected component** of a directed graph $G = (V, E)$ is any maximal subset of vertices $C \subseteq V$ such that all vertices in C are pairwise reachable.

Input: a directed, unweighted graph $G = (V, E)$

Output: the number of strongly connected components in G

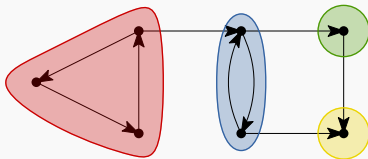


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Strongly Connected Components: Tarjan's Algorithm

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#include <boost/graph/strong_components.hpp>
```

```
void strong_connected_comp(const graph &G) {  
    int n = boost::num_vertices(G);  
  
    std::vector<int> scc_map(n); // exterior property map  
  
    int nsc = boost::strong_components(G,  
        boost::make_iterator_property_map(scc_map.begin(),  
        boost::get(boost::vertex_index, G)));  
  
    std::cout << "Number of connected components: " << nsc << "\n";  
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Time complexity of `boost::strong_components` is $O(m + n)$.

Declaring Graphs in BGL

Examples of standard graph algorithms in BGL

Tutorial Problem

Overview

Tutorial problem: Universal Warehouses

B-city is made of multiple locations, linked by unidirectional roads. Alice wants to create a delivery empire, able to deliver anywhere in the city. For this she needs to decide where to build her warehouse. She wants it to be universal: any point in the city must be reachable from this warehouse. To make the best decision, she asks you to find all possible warehouse locations, that is to say all universal locations in the city.

Constraints

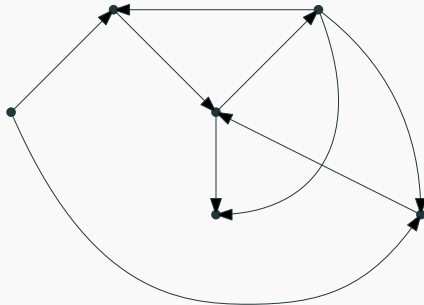
1s

$0 \leq n \leq 5 \cdot 10^4$ number of locations

$0 \leq m \leq 5 \cdot 10^4$ number of roads.

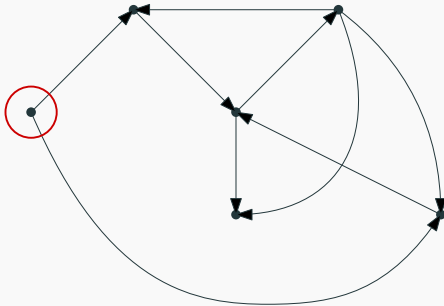
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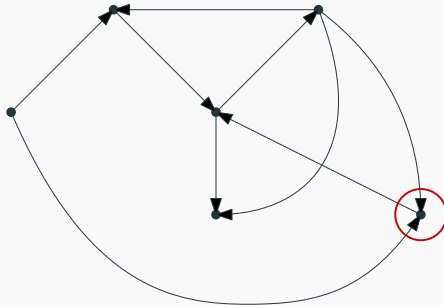
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This vertex is universal

Tutorial problem: Universal Warehouses

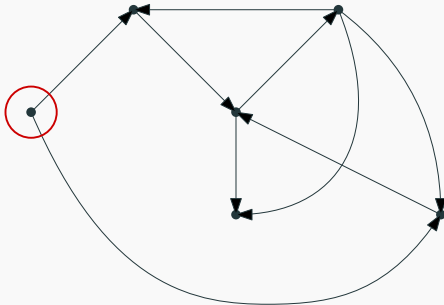
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This vertex is **not** universal (no way to reach the left most)

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In this graph there is a unique universal vertex

Tutorial problem: Formal Problem Statement

Input: A directed, unweighted graph $G = (V, E)$

Output: All universal vertices in G

First approach

How do we test if a given vertex $v \in V$ is universal?

First approach

How do we test if a given vertex $v \in V$ is universal?

\Rightarrow start a BFS in v , if it visits all vertices $\rightarrow v$ is universal

Code

```
#include <boost/graph/breadth_first_search.hpp>
#include <boost/graph/properties.hpp>

typedef boost::adjacency_list<boost::vecS, boost::vecS, boost::directedS> graph;
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    int n = boost::num_vertices(G);
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    boost::breadth_first_search(G, u,
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    // u is universal iff no vertex is white
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First approach

How do we test if a given vertex $v \in V$ is universal?

\Rightarrow start a BFS in v , if it visits all vertices $\rightarrow v$ is universal

Complexity?

First approach

How do we test if a given vertex $v \in V$ is universal?

\Rightarrow start a BFS in v , if it visits all vertices $\rightarrow v$ is universal

Complexity?

For each vertex: $O(n + m)$.

Altogether: $O(n(n + m))$.

For $n \leq 5 \cdot 10^4$ and $m \leq 5 \cdot 10^4$
we get $\sim 5 \cdot 10^{10} \gg 10^7$.

\Rightarrow too slow

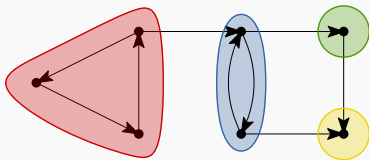
Second approach

How could we "group" vertices instead of checking them individually?

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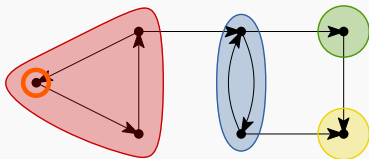
Recall strongly connected components:



Second approach

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Recall strongly connected components:

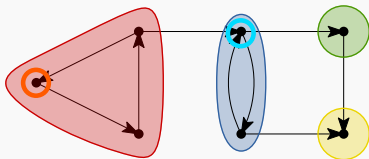


If u is universal, so is its strongly connected component.

Second approach

How could we "group" vertices instead of checking them individually?

Recall strongly connected components:



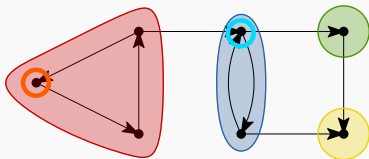
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If u can reach v , then u can reach any node in v strongly connected component.

Second approach

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Recall strongly connected components:



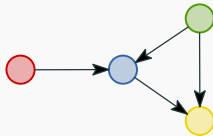
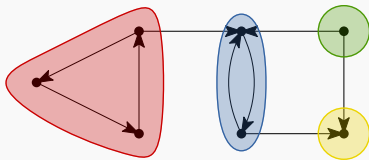
If u is universal, so is its strongly connected component.

If u can reach v , then u can reach any node in v strongly connected component.

\Rightarrow we can work directly on the strongly connected components

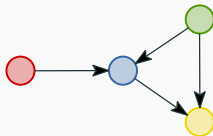
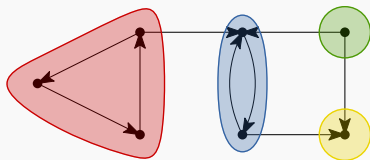
Second approach

Working on the strongly connected components: condensation of G



Second approach

Working on the strongly connected components: condensation of G

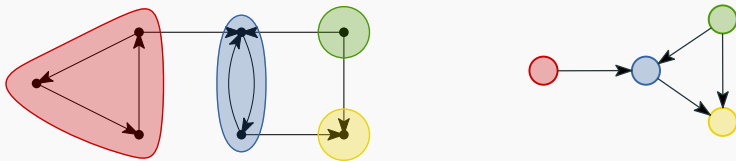


The condensation of G is acyclic.

\Rightarrow there are source SCC.

Second approach

Working on the strongly connected components: condensation of G



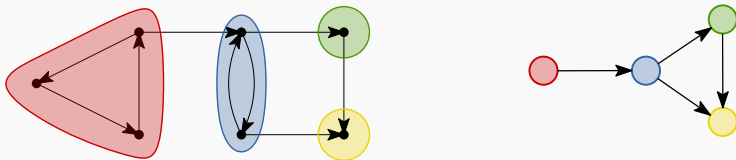
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If more than one source SCC: no universal nodes.

Second approach

Working on the strongly connected components: condensation of G



The condensation of G is acyclic.

\Rightarrow there are source SCC.

If more than one source SCC: no universal nodes.

Else (exactly 1 source SCC): all its vertices are universal.

Second approach – Algorithm

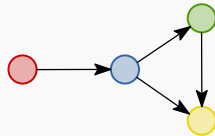
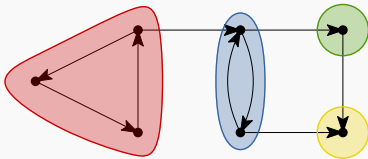
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2. Check which SCCs are source SCCs

Second approach – Algorithm

1. Compute the SCCs of G
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3. If there is more than one source SCC \Rightarrow no universal vertex
4. Else there is exactly one source SCC \Rightarrow all vertices in this SCC

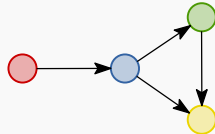
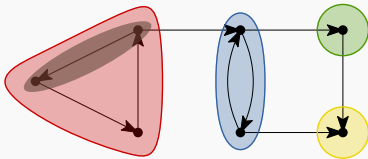
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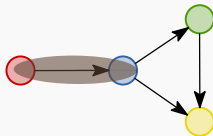
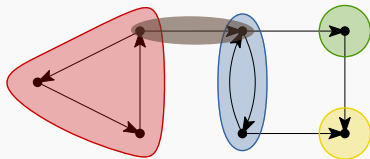
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Complexity?

Second approach – Algorithm

1. Compute the SCCs of $G \implies O(n + m)$
2. Check which SCCs are source SCCs $\implies O(m)$
3. If there is more than one source SCC \implies no universal vertex
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Complexity?

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1. Compute the SCCs of $G \implies O(n + m)$
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3. If there is more than one source SCC \implies no universal vertex
4. Else there is exactly one source SCC \implies all vertices in this SCC

Complexity?

Altogether: $O(n + m)$.

For $n \leq 5 \cdot 10^4$ and $m \leq 5 \cdot 10^4$
we get $\sim 10^5 < 10^7$.
 \implies it fits!

Tutorial Problem: Full Solution - Build the graph

```
#include <boost/graph/adjacency_list.hpp>
```

```
#include <boost/graph/strong_components.hpp>
```

```
typedef boost::adjacency_list<boost::vecS, boost::vecS, boost::directedS> graph;
```

```
typedef boost::graph_traits<graph>::edge_iterator edge_it;
```

```
void testcase() {
```

```
    int n, m;
```

```
    std::cin >> n >> m;
```

```
    graph G(n);
```

```
    for (int i = 0; i < m; ++i) {
```

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        int u, v;
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```
        boost::add_edge(u, v, G);
```

```
    }
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Tutorial Problem: Full Solution — Strongly Connected Components

```
// scc_map[i]: index of SCC containing i-th vertex
std::vector<int> scc_map(n); // exterior property map
// nsc: total number of SCCs
int nsc = boost::strong_components(G,
    boost::make_iterator_property_map(scc_map.begin(),
    boost::get(boost::vertex_index, G)));
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Tutorial Problem: Full Solution – Source SCCs

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// is_src[i]: is i-th SCC a source?
std::vector<bool> is_src(nsc, true);
edge_it ebeg, eend;

for (boost::tie(ebeg, eend) = boost::edges(G); ebeg != eend; ++ebeg) {
    int u = boost::source(*ebeg, G), v = boost::target(*ebeg, G);
    // edge (u, v) in G implies that component scc_map[v] is not a source
    if (scc_map[u] != scc_map[v]) is_src[scc_map[v]] = false;
}
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Tutorial Problem: Full Solution – Source SCCs

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Tutorial Problem: Full Solution – Finding All Universal Vertices

```
int src_count = std::count(is_src.begin(), is_src.end(), true);
if (src_count > 1) { // no universal vertex among multiple SCCs
    std::cout << "\n";
    return;
}
assert(src_count == 1);
// recall property of the condensation DAG (directed acyclic graph)

// all vertices in the single source SCC are universal
for (int v = 0; v < n; ++v) {
    if (is_src[scc_map[v]]) std::cout << v << " ";
}
std::cout << "\n";
} /* end of function testcase */
```

Tutorial Problem: Full Solution – Finding All Universal Vertices

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Declaring Graphs in BGL

Examples of standard graph algorithms in BGL

Tutorial Problem

Overview

Overview

The following algorithms can appear in exercises. Please familiarize yourself with them. This list is non exhaustive and will be extended throughout the course.

Algorithm	Runtime
<code>boost::breadth_first_search</code>	$O(n + m)$
<code>boost::depth_first_search</code>	$O(n + m)$
<code>boost::dijkstra_shortest_path</code>	$O(n \log n + m)$
<code>boost::kruskal_minimum_spanning_tree</code>	$O(m \log m)$
<code>boost::edmonds_maximum_cardinality_matching</code>	$O(mn \cdot \alpha(m, n))$
<code>boost::strong_components</code>	$O(n + m)$
<code>boost::connected_components</code>	$O(n + m)$
<code>boost::biconnected_components</code>	$O(n + m)$
<code>boost::articulation_points</code>	$O(n + m)$
<code>boost::is_bipartite</code>	$O(n + m)$

Biconnected Components

A **biconnected graph** is an undirected graph that is connected, and remains connected even if a vertex is removed. A **biconnected component** is any maximal subgraph of G that is biconnected.

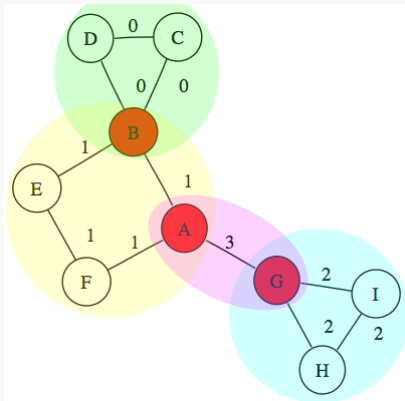


Image from boost documentation

Articulation Points

An **articulation point** of a undirected graph is any vertex part of two biconnected components.

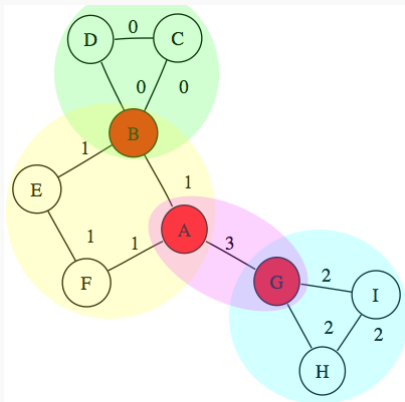
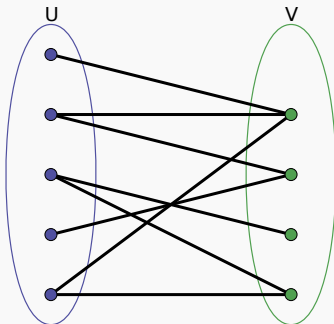


Image from boost documentation

Bipartite Graph

A graph $G = (V, E)$ is **bipartite** if V can be split in two subsets U , V such that all edges in E have an extremity in each.



What next?

- Read up on theory if something today was new to you
- Familiarize yourself with BGL
- We provide some very easy problems to get used to the typedefs
 - also code snippets