

4.5 Profiling

Before I Forget!

Facebook Programming Competition:

- 5th March
- 2.5 hours, 5 problems
- C, C++, Java
- Quiet Labs
- Facebook recruiters, food and swag
- See you there! <http://io.gd/2F>

Profiling - Memory Usage

Agenda

1. Memory profiling
2. Graphs representation
3. The dot language
4. Graphs Traversal
5. Topological Sorting

Profiling - Memory Usage

Ever thought about how much memory your program uses?

Profiling - Memory Usage

- You could use

```
long used = Runtime.getRuntime().freeMemory()  
// create some objects  
used -= Runtime.getRuntime().freeMemory()
```

- handle garbage collection, JVM non-determinism → Check [article](#)

Profiling - Memory Usage

- The [article](#):

Object	Size (Bytes)
java.lang.Object	
java.lang.Integer	
java.lang.String	

Profiling - Memory Usage

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Object	Size (Bytes)
java.lang.Object	8
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- Abstraction has some serious overheads!

Profiling - Use A Profiler!

- Sun JDK comes with a profiler installed
- Usually some place like
 - `/usr/lib/jvm/jdk-1.x.y/bin/jvisualvm`

Profiling - Memory Optimization

- Often have to deal with repeated strings (e.g. parsing a backend report)
- How can we reduce memory usage?

Profiling - Memory Optimization

- Often have to deal with repeated strings (e. g. parsing a backend report)
- How can we reduce memory usage?
- String **interning**!

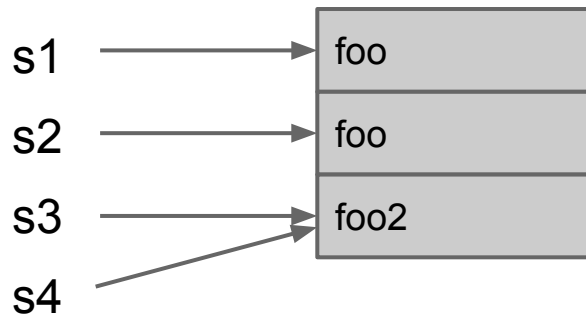
String Interning

```
String s1 = new String("foo");
```

```
String s2 = new String("foo");
```

```
String s3 = (new String("foo2")).intern();
```

```
String s3 = (new String("foo2")).intern();
```



5 Graphs

Representation

Adjacency Matrix

0 1 0

1 0 0

0 1 0

```
int g[n][n];
```

$O(n^2)$ memory

Adjacency List

0 -> 1

1 -> 0

2 -> 1

```
List<List<Integer>> g;
```

$O(E)$ memory

Traversals

- BFS

```
public static void dfsIterative(int start) {  
    Queue<Integer> queue = new Queue<>();  
    queue.add(start); seen[start] = true;  
    while (!queue.isEmpty()) {  
        int node = queue.remove();  
        for (int neighbour : nodes.get(node)) {  
            if (seen[neighbour]) continue;  
            seen[neighbour] = true;  
            queue.add(neighbour);  
        }  
    }  
}
```

Traversals

- Iterative DFS

```
public static void dfsIterative(int start) {  
    Stack<Integer> stack = new Stack<>();  
    stack.add(start); seen[start] = true;  
    while (!stack.isEmpty()) {  
        int node = stack.pop();  
        for (int neighbour : nodes.get(node)) {  
            if (seen[neighbour]) continue;  
            seen[neighbour] = true;  
            stack.push(neighbour);  
        }  
    }  
}
```

Traversals

- Recursive DFS

```
public static void dfs(int start) throws Exception {  
    seen[start] = true;  
    for (int neighbour : nodes.get(start)) {  
        if (!seen[neighbour]) {  
            // do something useful and recurse  
            dfs(neighbour);  
        }  
    }  
}
```

Traversals

- Recursive DFS - don't forget outer loop!

```
public static void dfs(int start) throws Exception {...}
```

```
for (int i = 0; i < n; i++) {  
    if (seen[i]) continue;  
    dfs(i);  
}
```

Traversals

- Recursive DFS - don't forget outer loop!

```
public static void dfs(int start) throws Exception {...}
```

```
for (int i = 0; i < n; i++) {  
    if (seen[i]) continue;  
    dfs(i);  
}
```

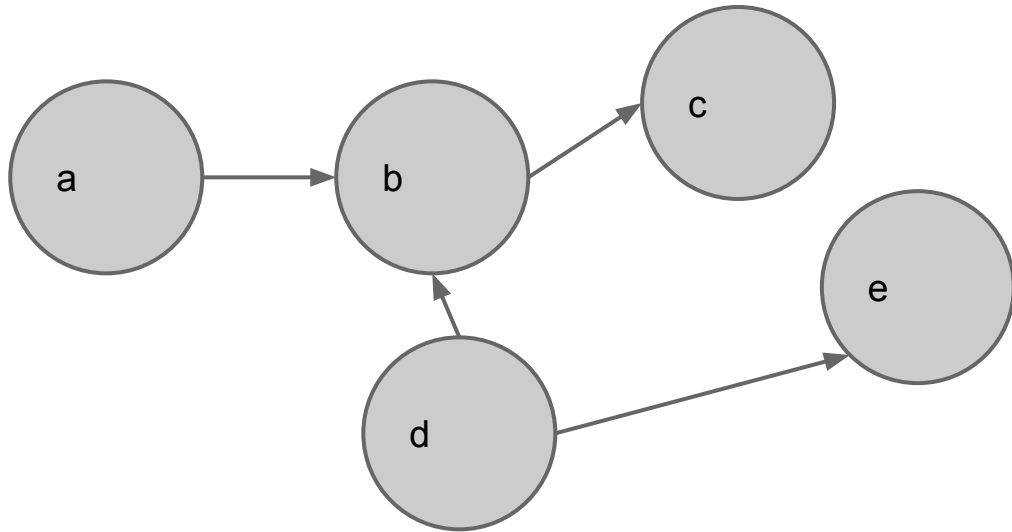
} Traverse all connected components!

Topological Sorting

- If there is an edge $a \rightarrow b$, then a is before b in the order
- “execution schedule” for dependent jobs

Topological Sorting

- “execution schedule” for dependent jobs



Topological Ordering:
a d b c e

Topological Sorting

1. Do a DFS from every unseen node
2. After a node has visited all neighbours:
add it to the front of the order
3. Print the order

Topological Sorting

```
public static void dfs(int start) throws Exception {  
    seen[start] = true;  
    for (int neighbour : nodes.get(start)) {  
        if (!seen[neighbour]) {  
            // do something useful and recurse  
            dfs(neighbour);  
        }  
    }  
}
```

Topological Sorting

```
public static void dfs(int start) throws Exception {  
    seen[start] = true;  
    for (int neighbour : nodes.get(start)) {  
        if (!seen[neighbour]) {  
            // do something useful and recurse  
            dfs(neighbour);  
        }  
    }  
    order.addFirst(start);  
}
```

Minimum Spanning Tree

Given an undirected, connected graph (G) , an MST is a minimum weight subgraph that contains all nodes of G .

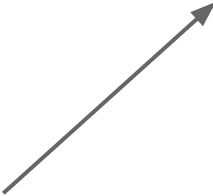
MST - Kruskal

1. Start with each vertex as a separate tree
2. Select minimum weight edge
3. If it connects nodes from diff. trees **merge** them
4. Repeat until no more edges left

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Need something that can do **merging** and **finding** of/in sets fast: http://en.wikipedia.org/wiki/Disjoint-set_data_structure



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Not in Collections API :(

MST - Prim

1. Start with one node, add it to V
2. E = closest edge with exactly one endpoint in V
3. add E to MST
4. Repeat 2 until V contains all nodes of G

Single Source Shortest Path

Find shortest path from one node to all others.


Single Source Shortest Path

Dijkstra's Algorithm:

1. Start with source node (S)
2. Select closest node to S (N)
3. For each neighbour E of N:
$$d(S, E) = \min(d(S, E), d(S, N) + d(N, E))$$
4. Repeat from 2 until no nodes left to check

Single Source Shortest Path

Dijkstra's Algorithm:

1. Start with source node (S)
2. Select closest node to S (N)  Need something to give us min() fast!
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Single Source Shortest Path

Dijkstra's Algorithm:

1. Start with source node (S)

2. Select closest node to S (N)

Need something
to give us min()

3. For each neighbour E of N:

fast!
Need fast updates!

$$d(S, E) = \min(d(S, E), d(S, N) + d(N, E))$$

4. Repeat from 2 until no nodes left to check

Single Source Shortest Path

Dijkstra's Algorithm:

- Fast min \Rightarrow PriorityQueue!
- Fast Updates? Could technically do in $O(\log(n))$

Single Source Shortest Path

Dijkstra's Algorithm:

- Fast min \Rightarrow PriorityQueue!
- Fast Updates? Could technically do in $O(\log(n))$
 - JavaDoc: *this implementation provides $O(\log(n))$ time for the enqueueing and dequeing methods (offer, poll, remove() and add); **linear time for the remove(Object) and contains(Object) methods**; and constant time for the retrieval methods (peek, element, and size).*

Single Source Shortest Path

Dijkstra's Algorithm:

- Obvious solution:
 - roll out our own

Single Source Shortest Path

Dijkstra's Algorithm:

- Obvious solution:
 - roll out our own
- Quick **hack** (generally good enough):
 - just leave nodes in the priority queue
 - keep track of what we've seen