

The background features a large, light blue watermark logo of the Technical University of Cluj-Napoca. The logo consists of a shield-like shape with the letters 'T' and 'U' integrated into its design. Above the shield, the words 'TECHNICAL UNIVERSITY' are written in a sans-serif font. Below the shield, the words 'OF CLUJ-NAPOCA' are written in a smaller sans-serif font. At the bottom of the logo, the words 'Computer Science' are written in a stylized, rounded font.

Fundamental Algorithms

Lecture #10

Cluj-Napoca

December, 4, 2018

Agenda

- **B trees – topic postponed for the end of the course (last lecture or so)**
- **Graphs**
 - **Representations**
 - **Concepts**
 - **BFS&DSF – just brief intro**
 - **Topological Sort (seminar)**
 - **Euler Cycle (Tour) (seminar)**
 - **Hamiltonian Circuit (seminar – why not)**
 - **Minimum Spanning Tree (MST) Kruskal**
 - **Minimum Spanning Tree (MST) Prim**
 - **BFS**

Graphs

- Representation
 - $G = (V, E)$ V = vertex set; E = edges set; $E \subseteq V \times V$
 - adjacency matrix
 - adjacency lists (preferred for sparse graphs)
- Notions
 - directed / undirected graphs / (**dag**)
 - weighted/ unweighted graphs
 - degree of a vertex / in&out degree
 - complete graph
 - diameter of a graph
 - connected / not connected

DFS & BFS importance

- Valuable as stand alone efficient *strategies* (solutions for many real world problems rely on them)
- Valuable for the various *outcomes* they produce
- Useful as *preprocessing* step in other algorithms
- Their *skeleton* useful for the design of other efficient algorithms (by changing /adapting / adding some steps)
- The search could be designed similar, and JUST replace the queue policy
- BFS uses a proper queue (FIFO)
- DFS uses stack (LIFO)

Minimum Spanning Tree (MST) the problem

- $G = (V, E), w(u, v), \forall u, v \in V$ //given a weighted graph
- Find $G' = (V, T)$ //find the subgraph
 - $T \subseteq E, |T| = |V| - 1$ T is a tree //all nodes, acyclic
 - $\sum w(T) = \min$ //weights the fewest
- For finding the MST a greedy strategy is applied, yet an optimal solution is found
 - What is the issue?
 - Discussion (review with highlights on essential aspects) on greedy strategy - orally

Minimum Spanning Tree applications

- Network (real-world problems) design.
 - telephone, electrical, hydraulic, TV cable, computer, road
- Approximation algorithms for NP-hard problems.
 - TSP (traveling salesperson problem), Steiner tree
- Indirect applications.
 - max bottleneck paths
 - LDPC codes for error correction
(method of transmitting a message over a noisy transmission channel; is constructed using a sparse *bipartite graph* - seminar)
 - learning salient features for real-time face verification
 - reducing data storage in sequencing amino acids in a protein
 - model locality of particle interactions in turbulent fluid flows
 - autoconfig protocol for Ethernet bridging to avoid cycles in a network

Kruskal's MST - approach

- Try to form the tree by joining different partially built trees
- Initially each vertex is in an individual (different) tree (that is, **all vertices** are **in** the solution, **no edge** belong to the solution yet)
- Each step joins the **closest** trees (i.e. 2 trees which are far apart by the smallest edge not yet considered from E) => **selects $|V| - 1$ smallest edges**
- Join should be performed on **different** trees (i.e. do NOT join different branches of the **same** tree => avoid cycle; no longer a tree) – use disjoint sets
 - Unify (x, y) joins 2 disjoint sets – to which x and y belong
 - Find-Set (x) Returns a pointer to the representative element of the set to which x belongs

Kruskal's MST – algorithm

MST_Kruskal (G, w) //1956

```
A ←  $\bar{\emptyset}$  //set A contains the solution in terms of
           // edges considered for addition
for each vertex v ∈ V[G]
  do Build-Set (v)
sort (E) //edges considered for inclusion in order
for each edge (u, v) ∈ E (taken ordered)
  do if Find-Set (u) <> Find-Set (v)
      then A ← A ∪ {(u, v)}
           Unify (u, v)
return A
```


Kruskal's MST – efficiency; Q&A

- The most expensive step ?
- If optimal (ElgE)
- Trace the algorithm (blackboard; visualize the **tree**)
- Q&A (As orally)
 - Is the solution unique? Justify!
 - Is the algorithm deterministic? Explain!
 - How can we obtain a different solution?
 - All solutions?
 - Prove the Kruskal's solution IS optimal (although applies a greedy strategy – informal justification. Check textbook for a formal and complete proof)

Prim's MST - approach

- 1957 Prim (following Jarnik's 1930 solution)
- Also a greedy approach
- Initially solution **empty** (no vertex, no edge)
- Starts by choosing an initial (ANY) vertex (the root of the tree)
- In each of the $|V| - 1$ steps, selects the **closest vertex** not yet considered to be added to the tree (add to the solution the selected vertex and the edge connecting it to the so far built tree)
- The structure remains always a tree (i.e. no cycles)
- Keeps 2 additional info:
 - **parent** node (π) - initially all nil
 - **distance** to the parent node (key) – initially all infinity

Prim's MST - algorithm

```

MST_Prim (G, w, r)           //r = chosen root
Q ←  $\bar{V}[G]$ 
for each u ∈ Q
    do key[u] ←  $\infty$            //distance to the tree
         $\pi$ [u] ← nil             //parent in the tree
key[r] ← 0                       //r is the root, hence distance 0
 $\pi$ [r] ← nil                     //root has no parent
while Q <>  $\emptyset$ 
    do u ← Extract_Min(Q) //take closest node to the tree
        for each v ∈ Adj[u]
            do if v ∈ Q and w(u, v) < key[v]
//for nodes still in Q, in case their distance to the tree
// is larger than the direct edge, update the distance to the tree
            then  $\pi$ [v] ← u
                key[v] ← w(u, v)
    
```

Prim's MST – efficiency; Q&As

- Eff. Depends on how the Q is implemented
- If optimal
 - binary heaps
 - Each extract takes $\lg V$; Make E extracts
 - $O(E \lg V)$
 - Fibonacci heap
 - $O(E + V \lg V)$
- Trace the algorithm (blackboard)
- Q&A (As orally)
 - Advantage over Kruskal?
 - Builds a **rooted tree** (π) – hence you got a tree representation as output
 - Solution unique?
 - Algorithm deterministic?
 - Strategies for finding alternative solutions?
 - Prove the solution obtained by Prim is optimal

Graphs – Fundamental operations

Search

- BFS – the basis for MANY important algorithms on graphs (ex: Dijkstra's SSSP; Prim's MST)
- Description – S = source of **BFS**
 - produces a **bf-tree** with S as root
 - bf-tree contains all reachable (from S) vertices of G
 - name – due to the way the frontier is expanded
 - all nodes at distance k from S are discovered before ANY node at distance k+1
 - provides an **exhaustive search** (i.e. if a node is reachable, bfs will eventually find it) yet resource consuming (memory)
 - Q why/where is the memory consumption?
 - keeps paths of all branches

Graphs - BFS

- To keep track of the evolution, maintains each category of vertices (unvisited, under visiting, visited) under different sets (using colors attached to vertices)
- **White** – before processing vertices (unvisited)
 - initially all vertices are white;
 - a vertex is in the white set before the bfs reaches the vertex.
- **Gray** – under processing vertices (under visiting)
 - at the time a vertex is discovered, turns to gray;
 - it stays gray as long as it is in the processing stage (the bfs reached the vertex, the visit started yet didn't finish its processing);
 - the set of gray vertices represents the frontier (between processed/unprocessed vertices).
- **Black** – after processing vertices (visited)
 - a vertex turns black when we finished its processing;
 - a vertex is in the black set after the bfs processed the vertex and its (unvisited yet = gray) neighbors

BFS – the algorithm

bfs (G, s)

```

for each  $u \in V(G) - \{s\}$                                 //initialization step
  do color  $[u] \leftarrow$  white
    d $[u] \leftarrow \infty$                                 //distance from source
     $\pi[u] \leftarrow$  nil                                //parent node
color $[s] \leftarrow$  grey                                //initialize source
d $[s] \leftarrow 0$ 
 $\pi[s] \leftarrow$  nil
Q  $\leftarrow \{s\}$                                 //initialize Queue (FIFO policy)
while Q  $\neq \emptyset$                                 //as long as still have discovered vertices
  do u  $\leftarrow$  head [Q]                                //u – first from the Q; was NOT removed from Q
    for each  $v \in \text{Adj}[u]$                                 //take all the neighbor vertices
      do if color $[v] = \text{white}$  //only from outside the frontier
        then color $[v] \leftarrow$  grey
          d $[v] \leftarrow$  d $[u] + 1$ 
           $\pi[v] \leftarrow u$ 
          EnQ (Q, v)
    DeQ (Q)
color $[u] \leftarrow$  black

```

BFS - analysis

- Initialization steps: $O(V)$
- The adjacency list of each vertex is scanned only once (when the vertex reaches the head of the Q): $O(E)$
- The bfs alg: $O(V+E)$ (means $O(|V|+|E|)$)
- The predecessor subgraph ($\pi[s]$) forms a tree

$$G_{\pi}(V_{\pi}, E_{\pi})$$

$$V_{\pi} = \{v \mid v \in V, \pi[v] \neq \text{nil}\} \cup \{s\}$$

$$E_{\pi} = \{(v, \pi[v]) \mid (v, \pi[v]) \in E, v \in V_{\pi} - \{s\}\}$$