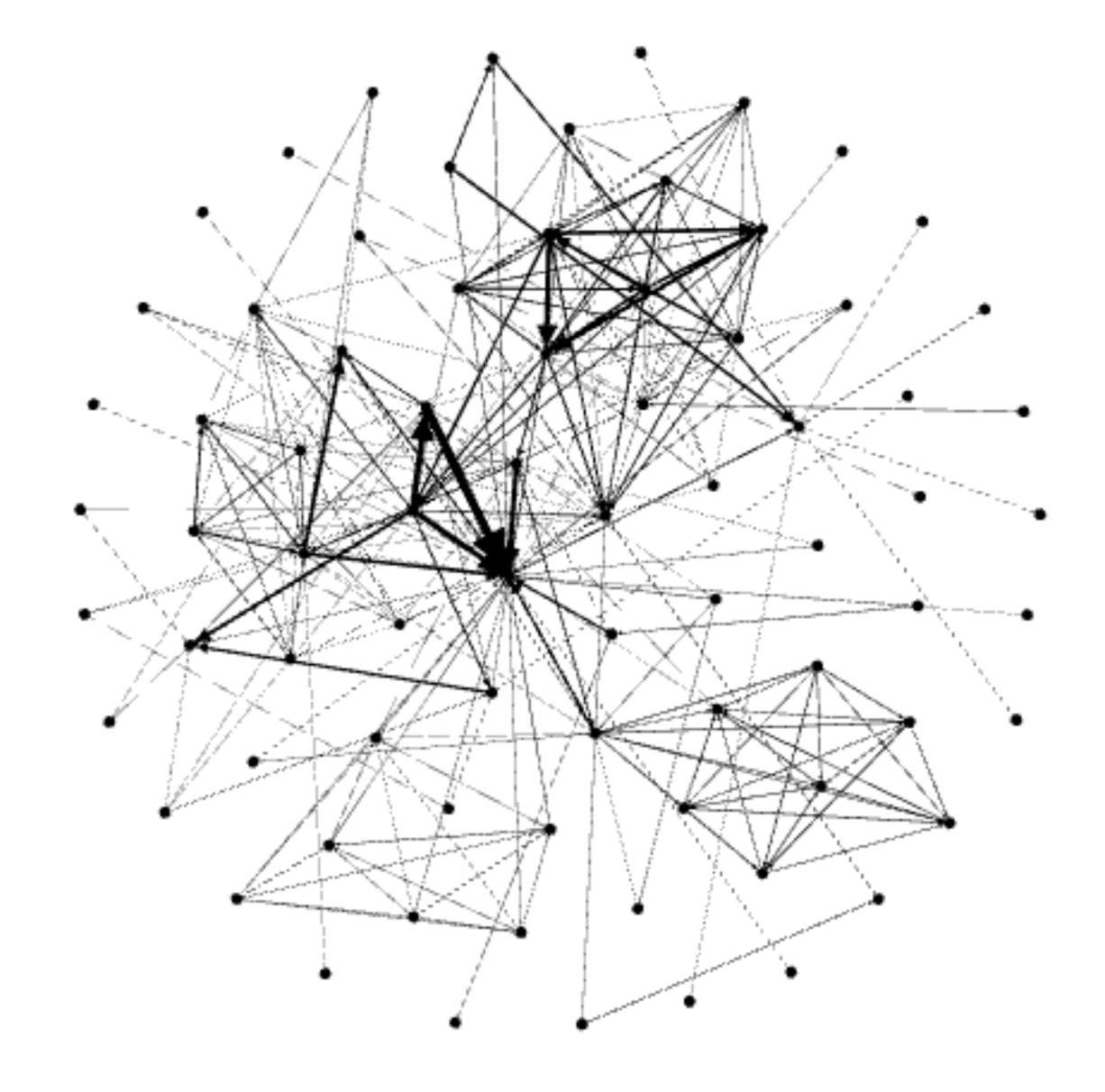
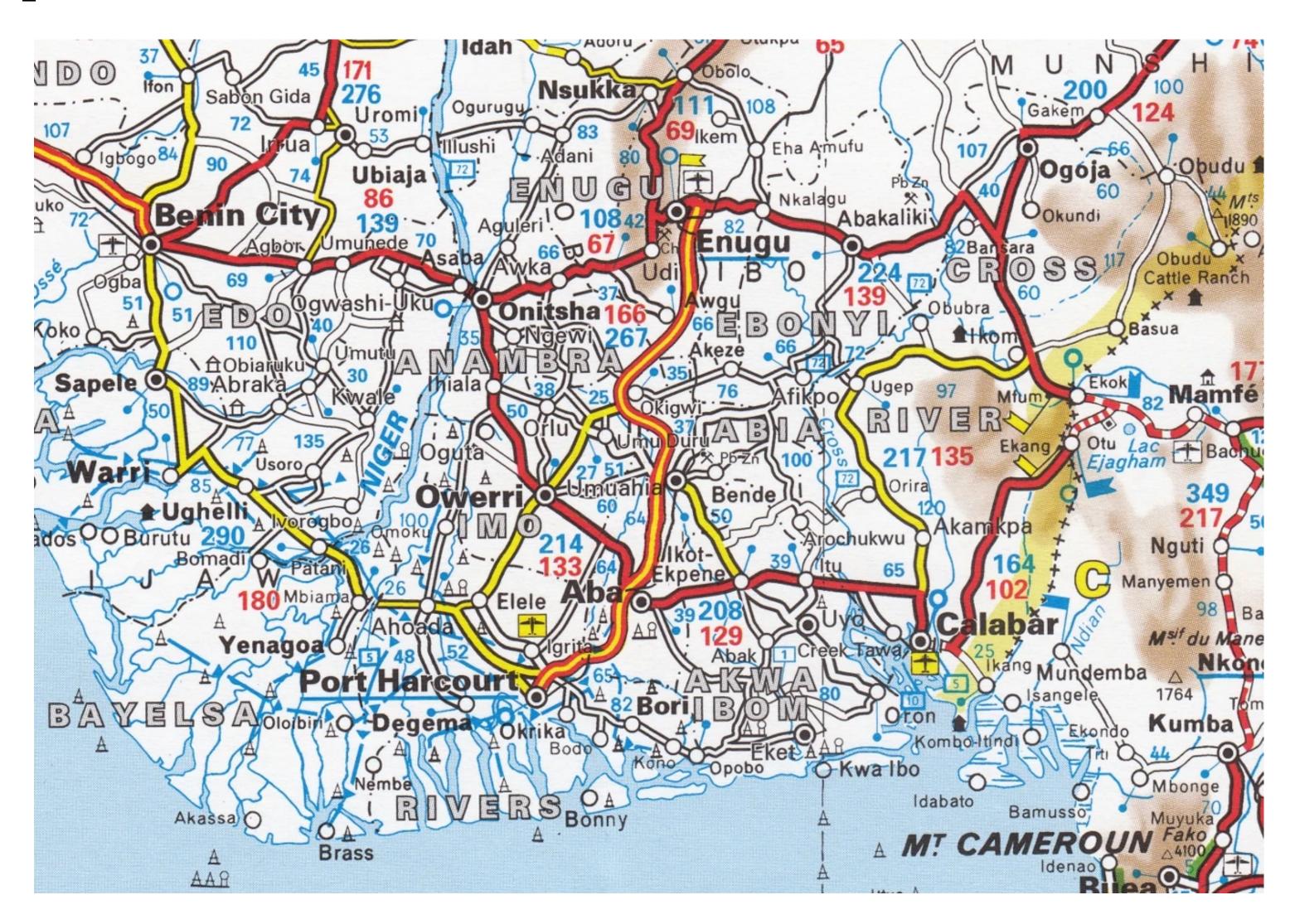


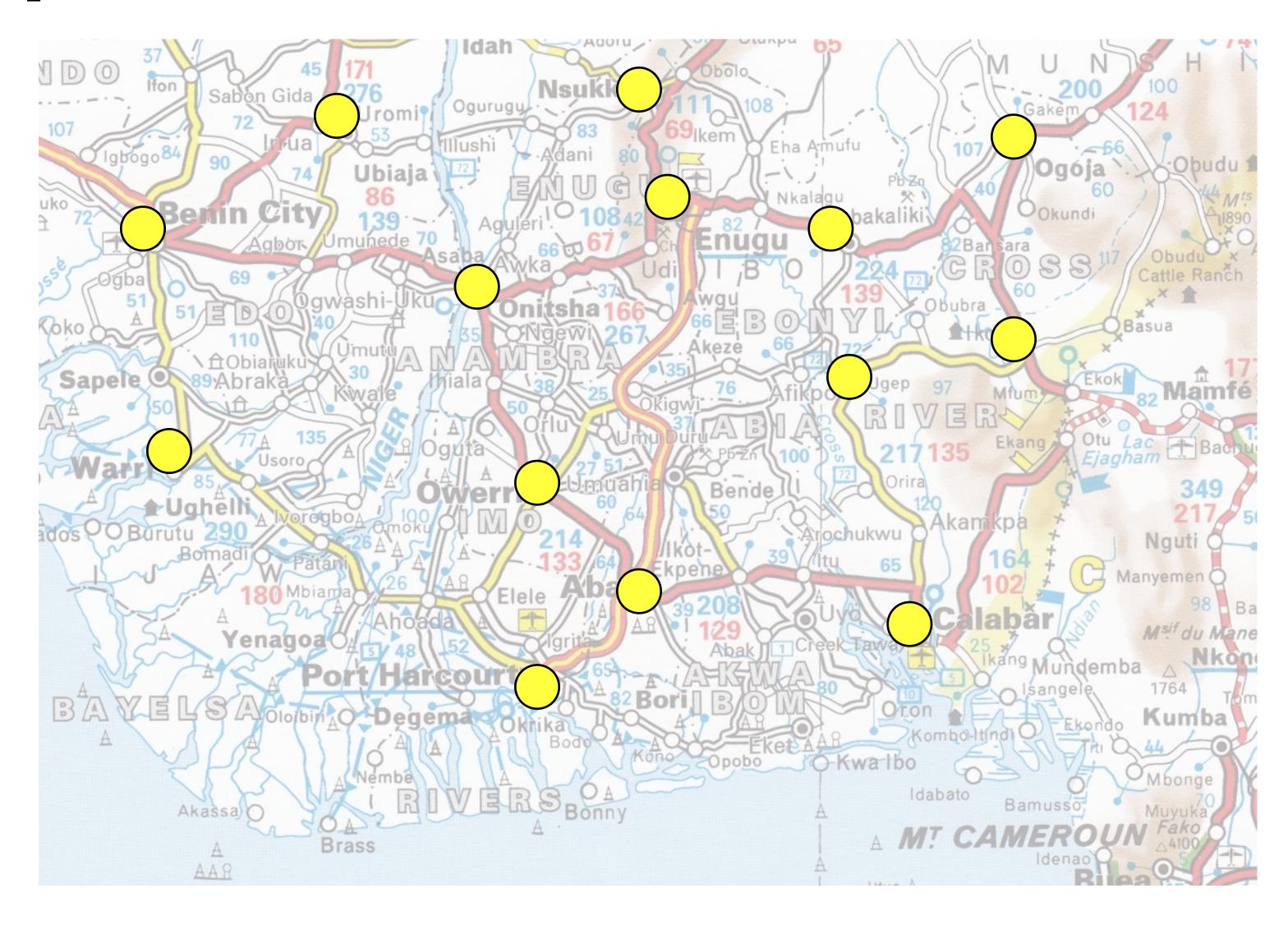


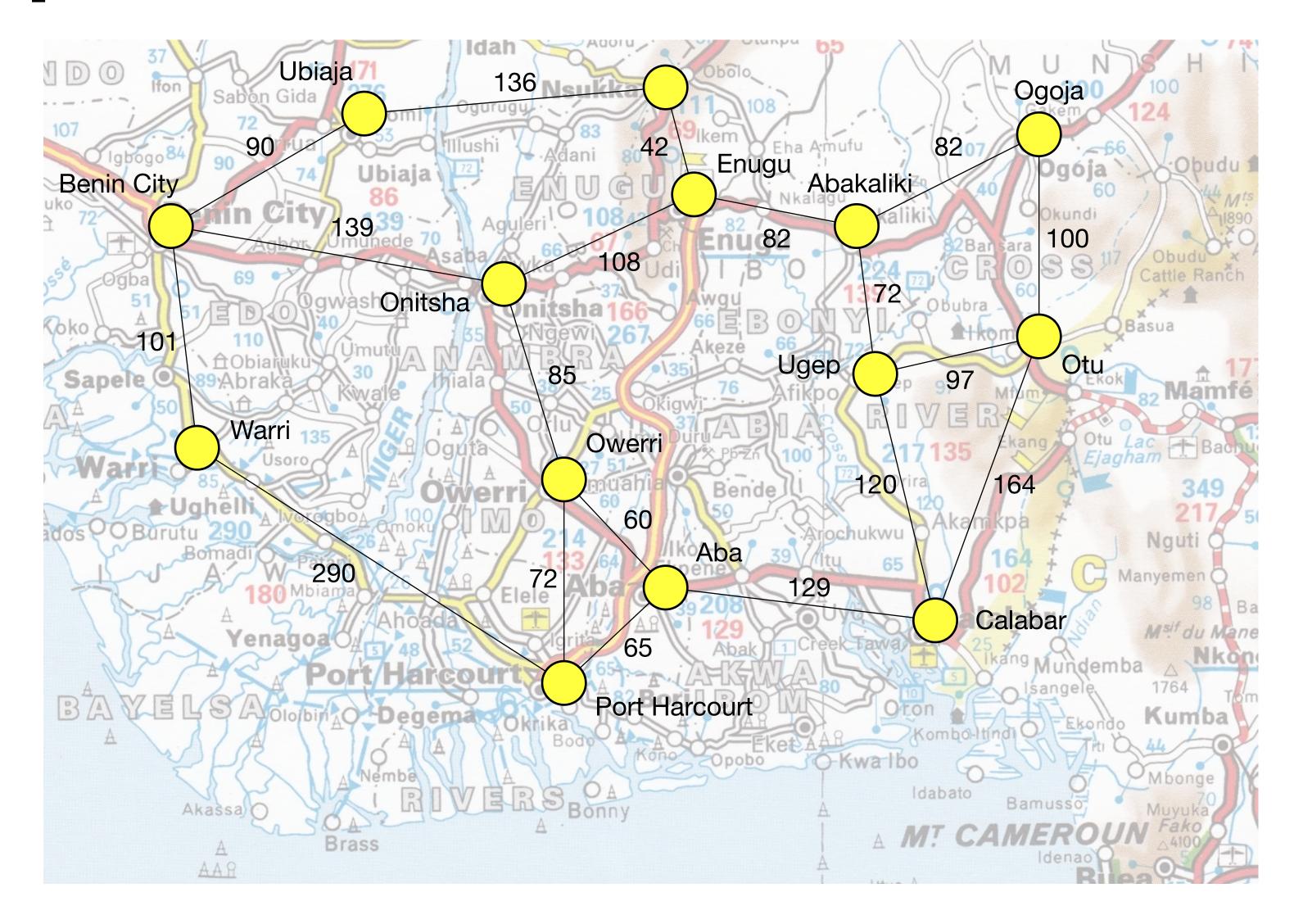
- Vehicle routing
- Network design
- Telecommunications
- Optimization

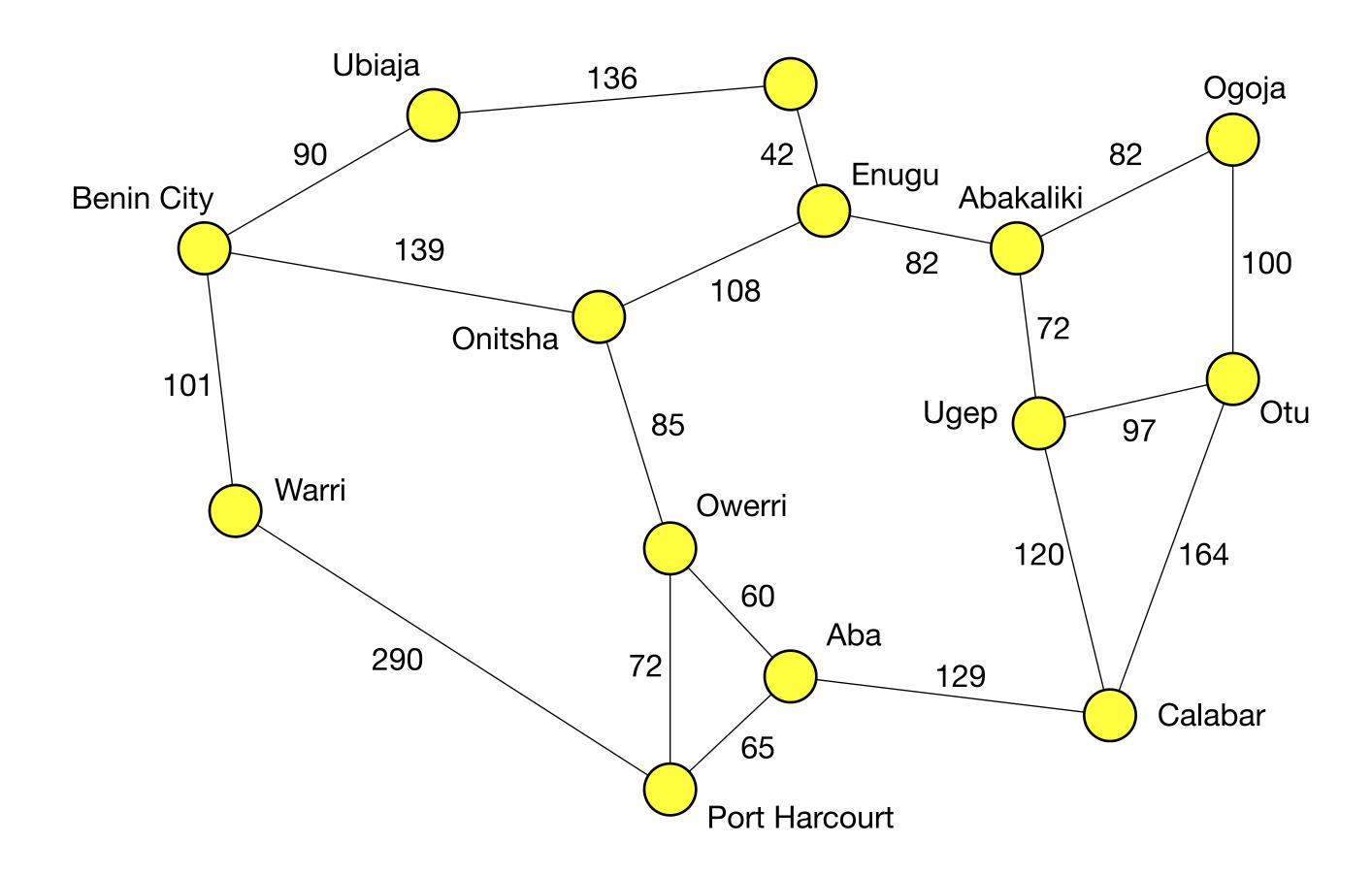


Weighted network of characters in Victor Hugo's Les Misérables, from the Stanford GraphBase, Knuth, 1993. Image generated with Gephi.



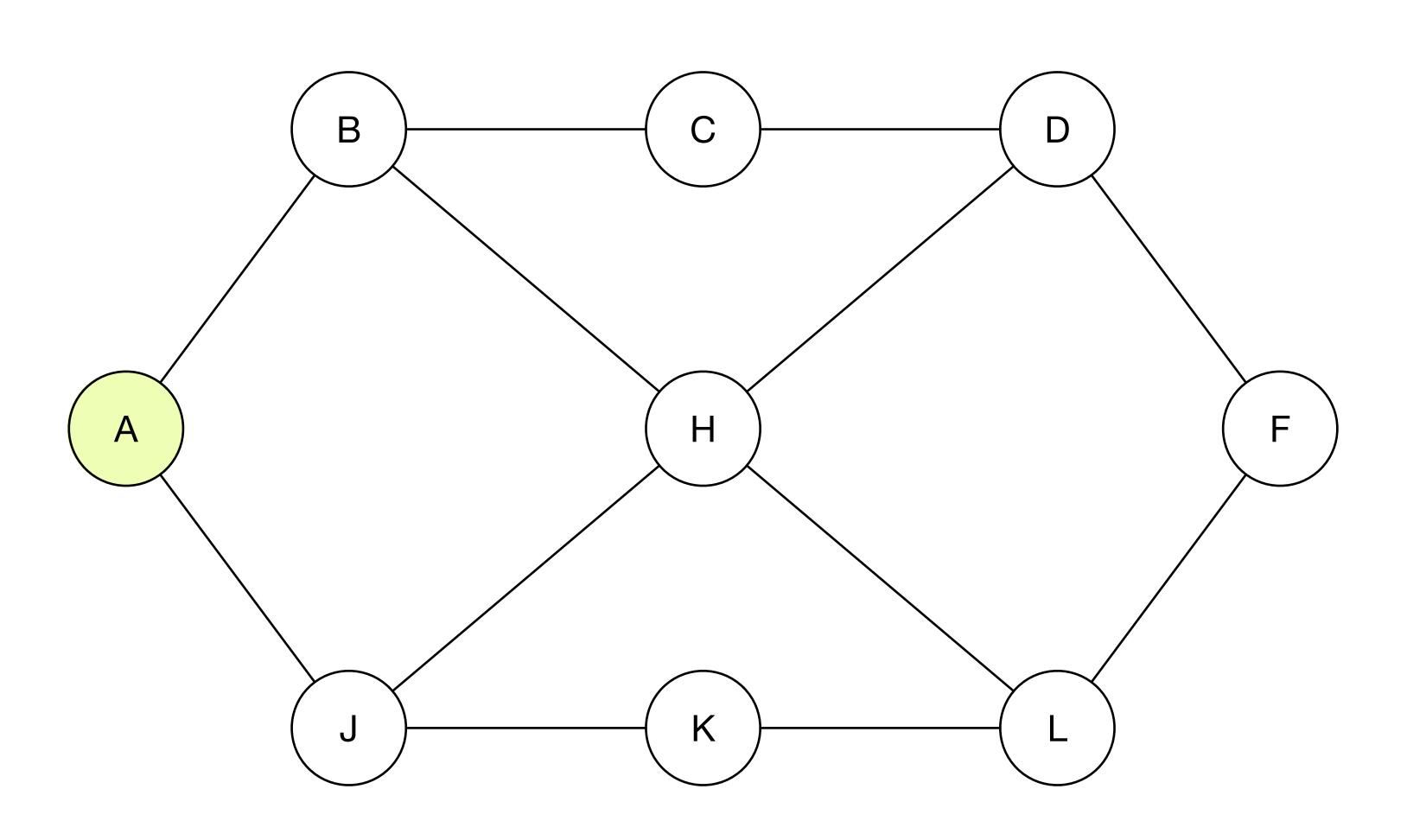




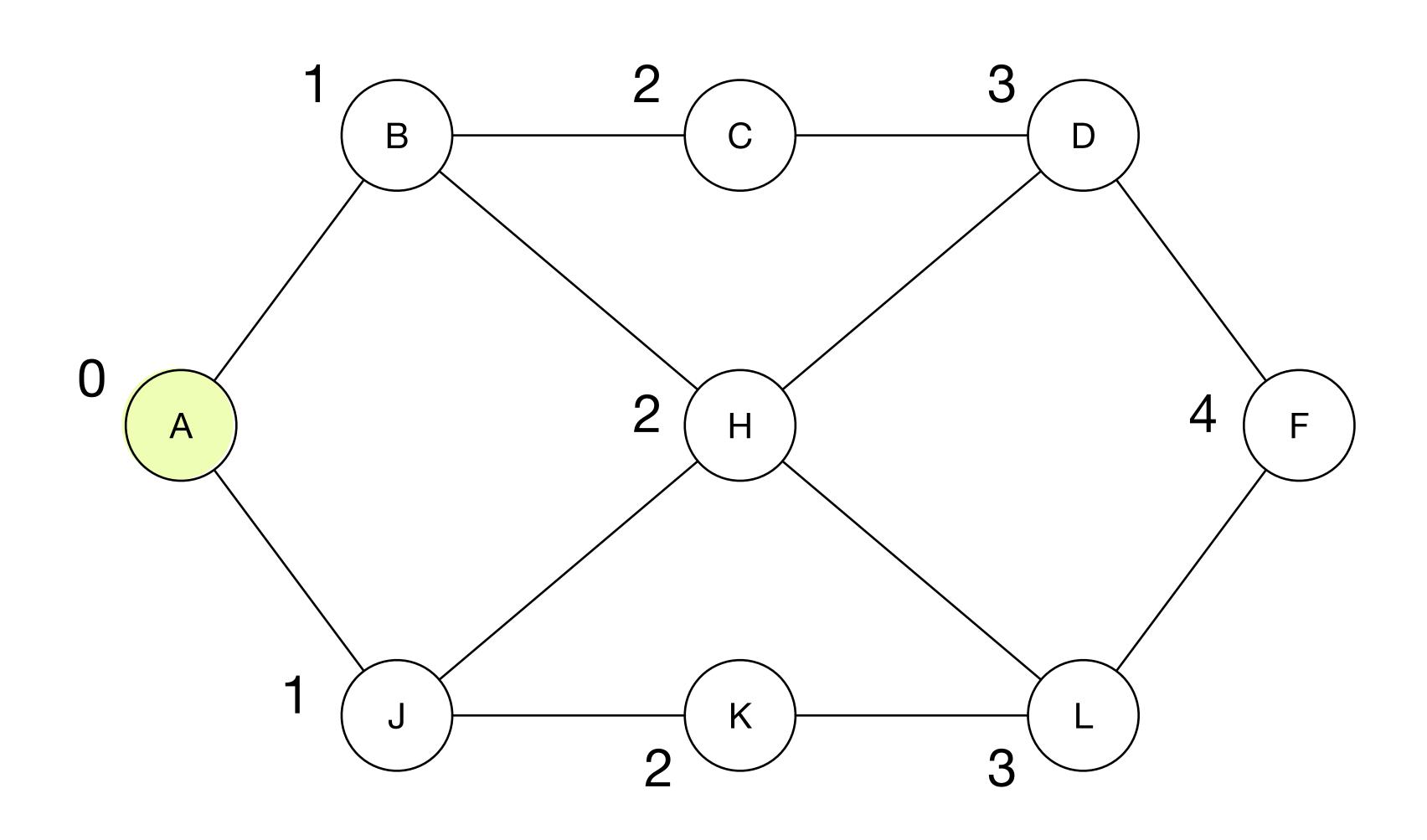


- Shortest paths from some node V₀ to all other nodes
- Shortest path from some node V₀ to one other node, V₁

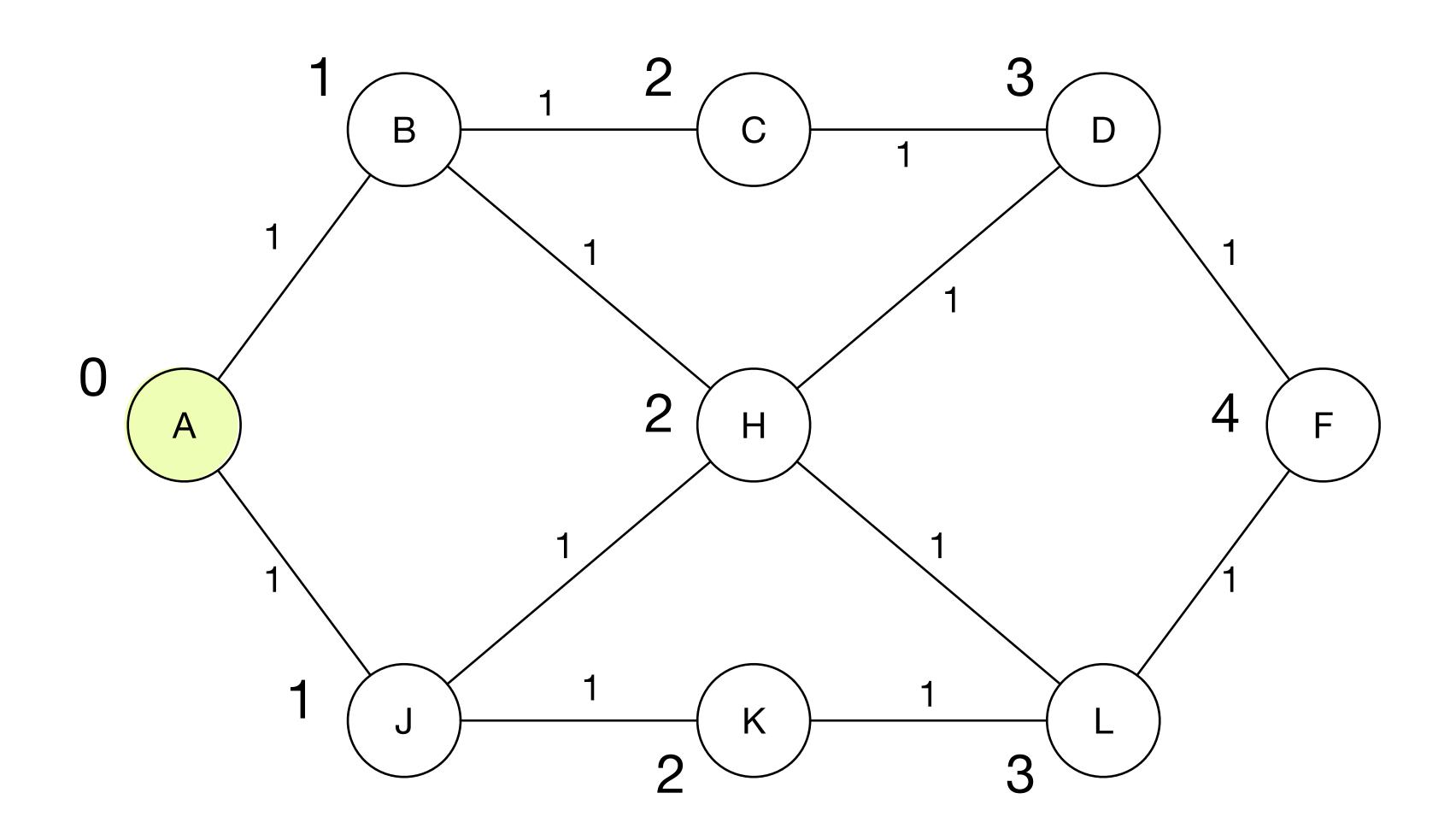
Shortest path, undirected, unweighted

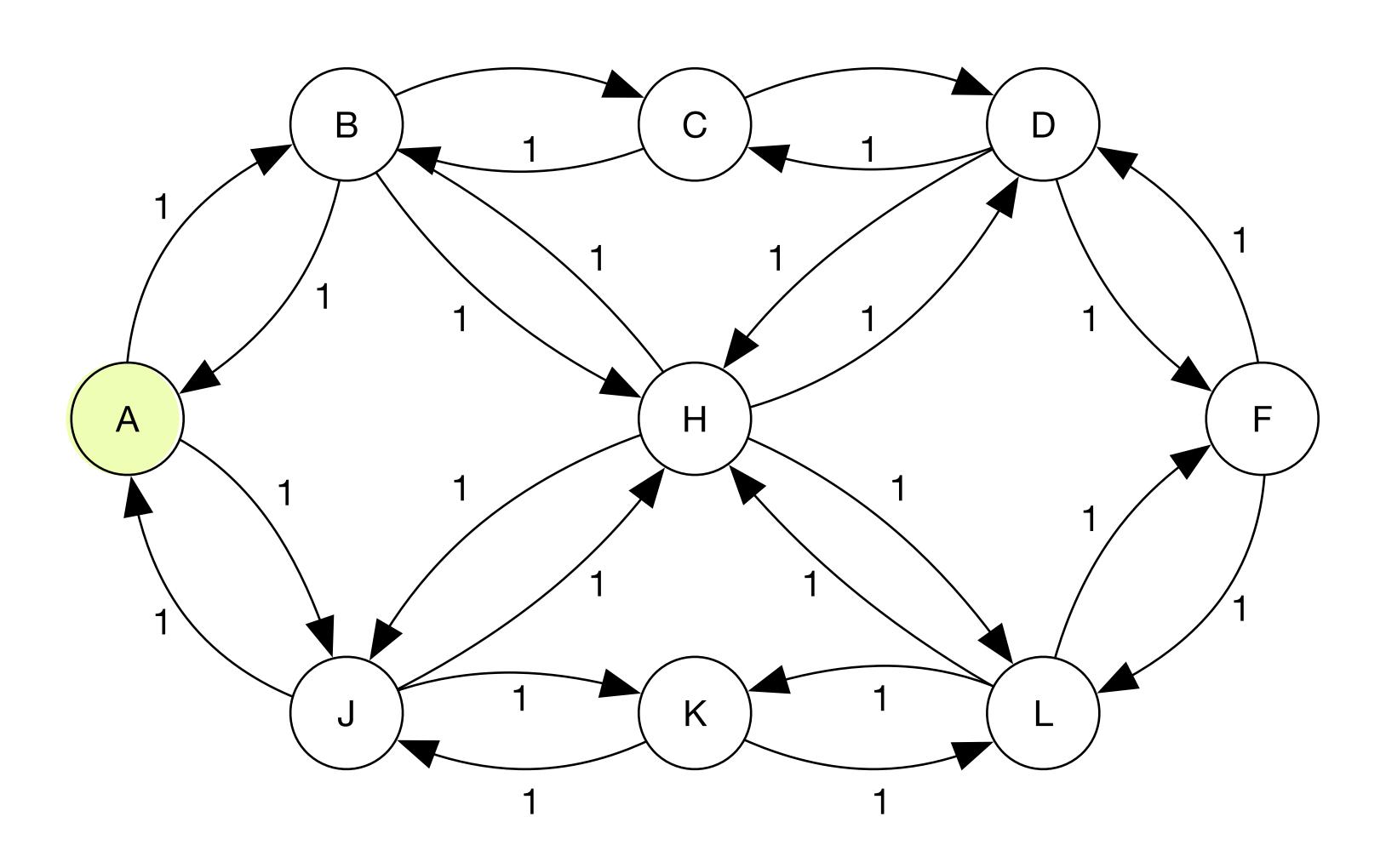


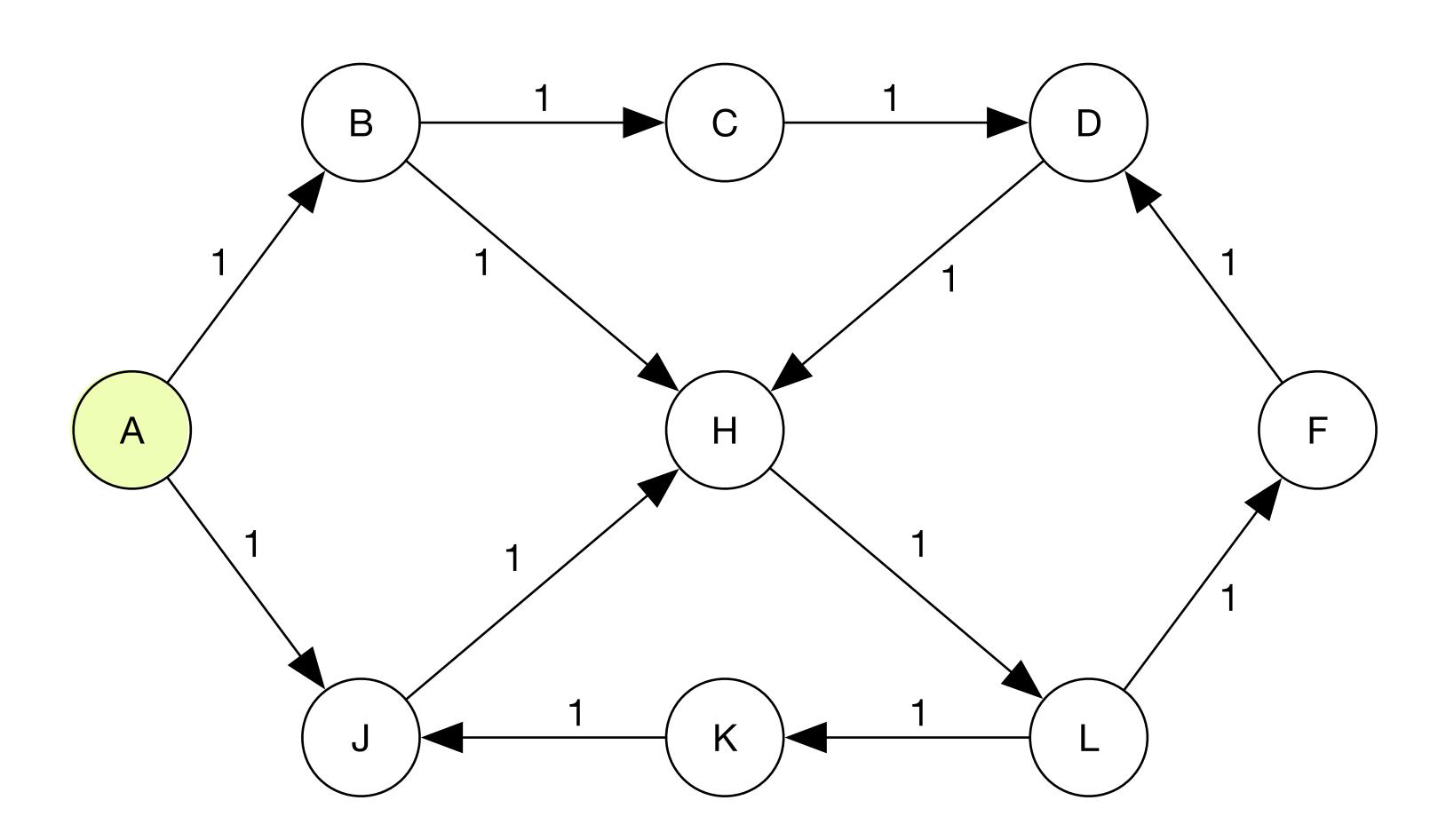
Shortest path, undirected, unweighted

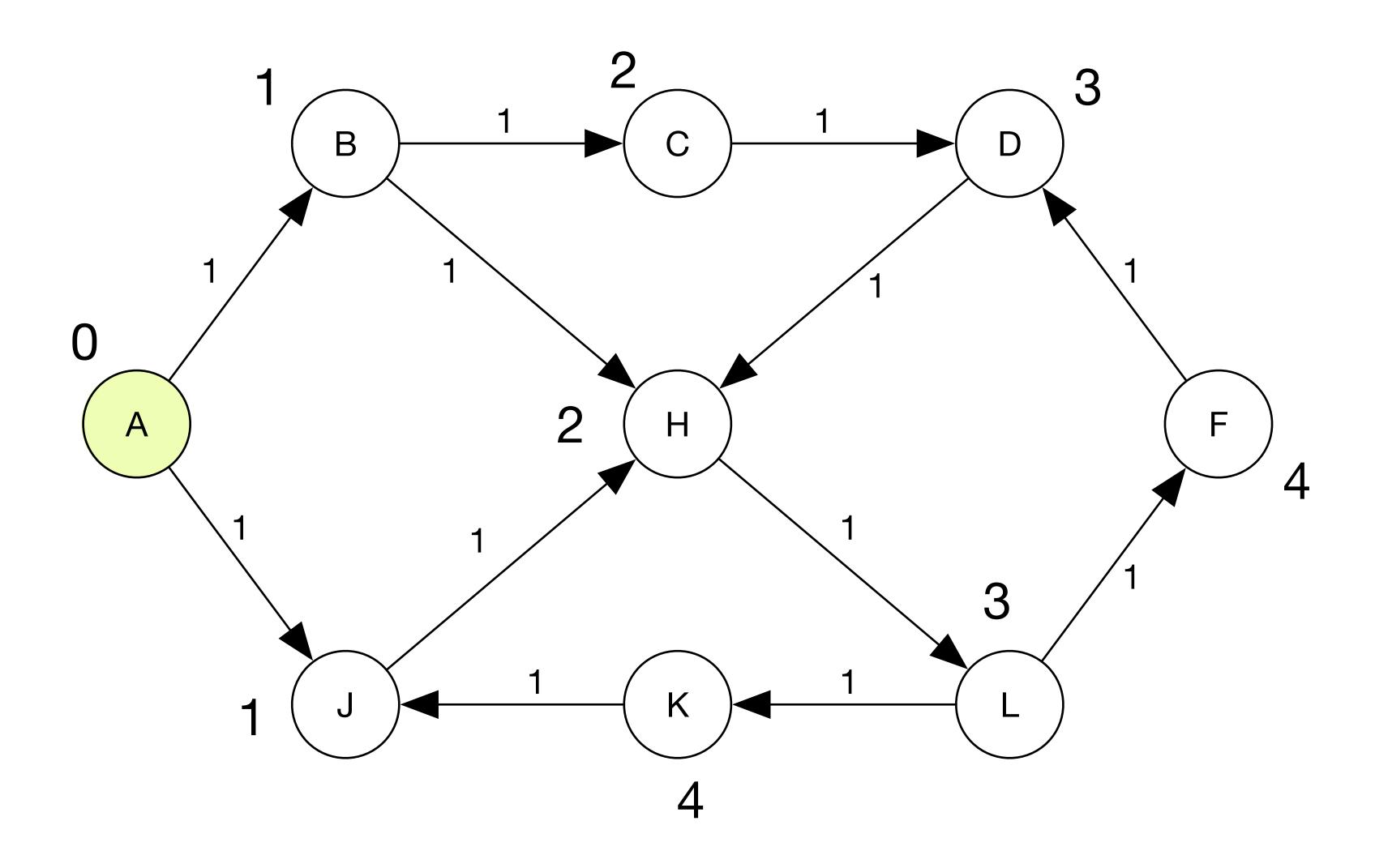


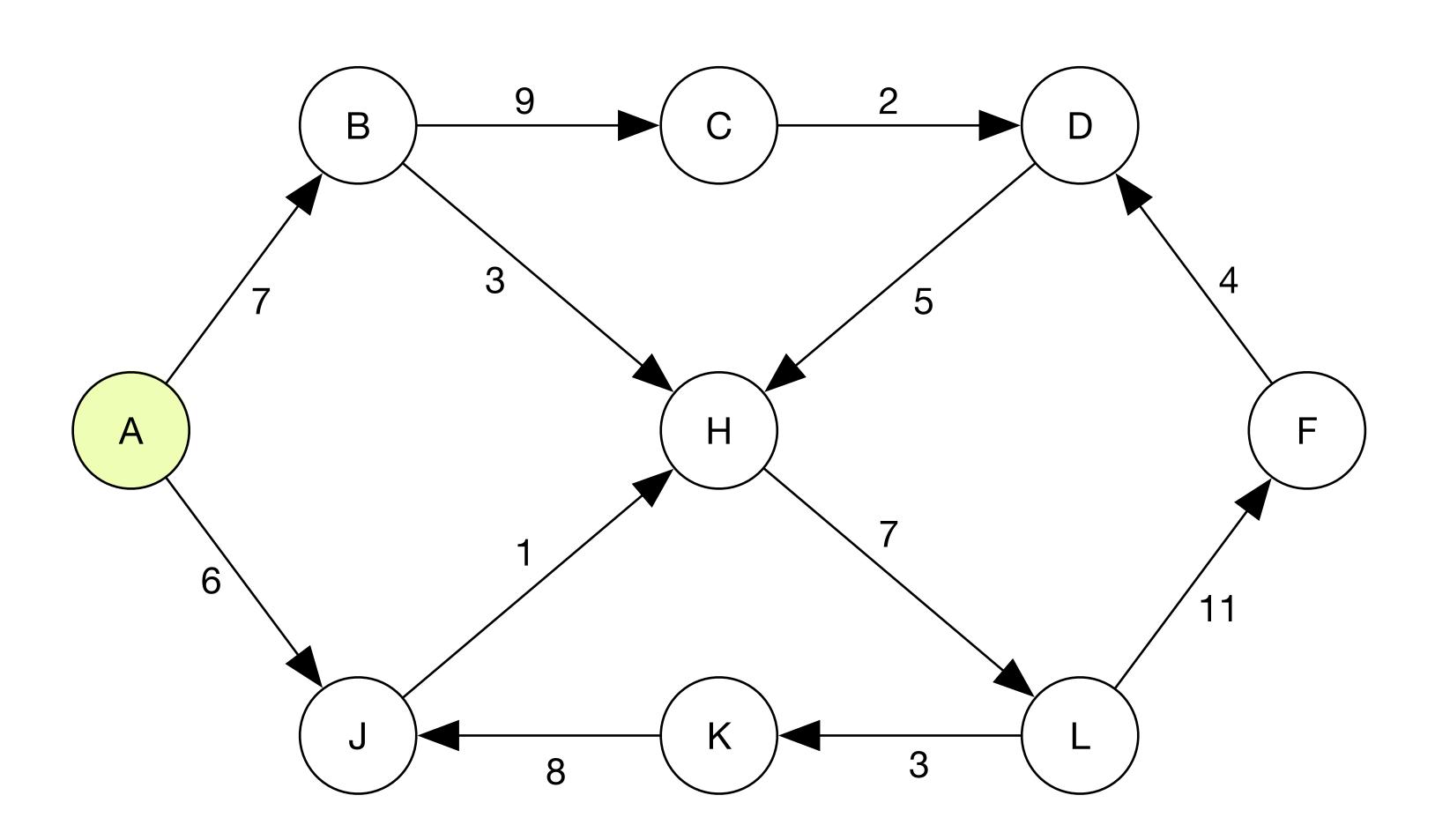
Shortest path, undirected

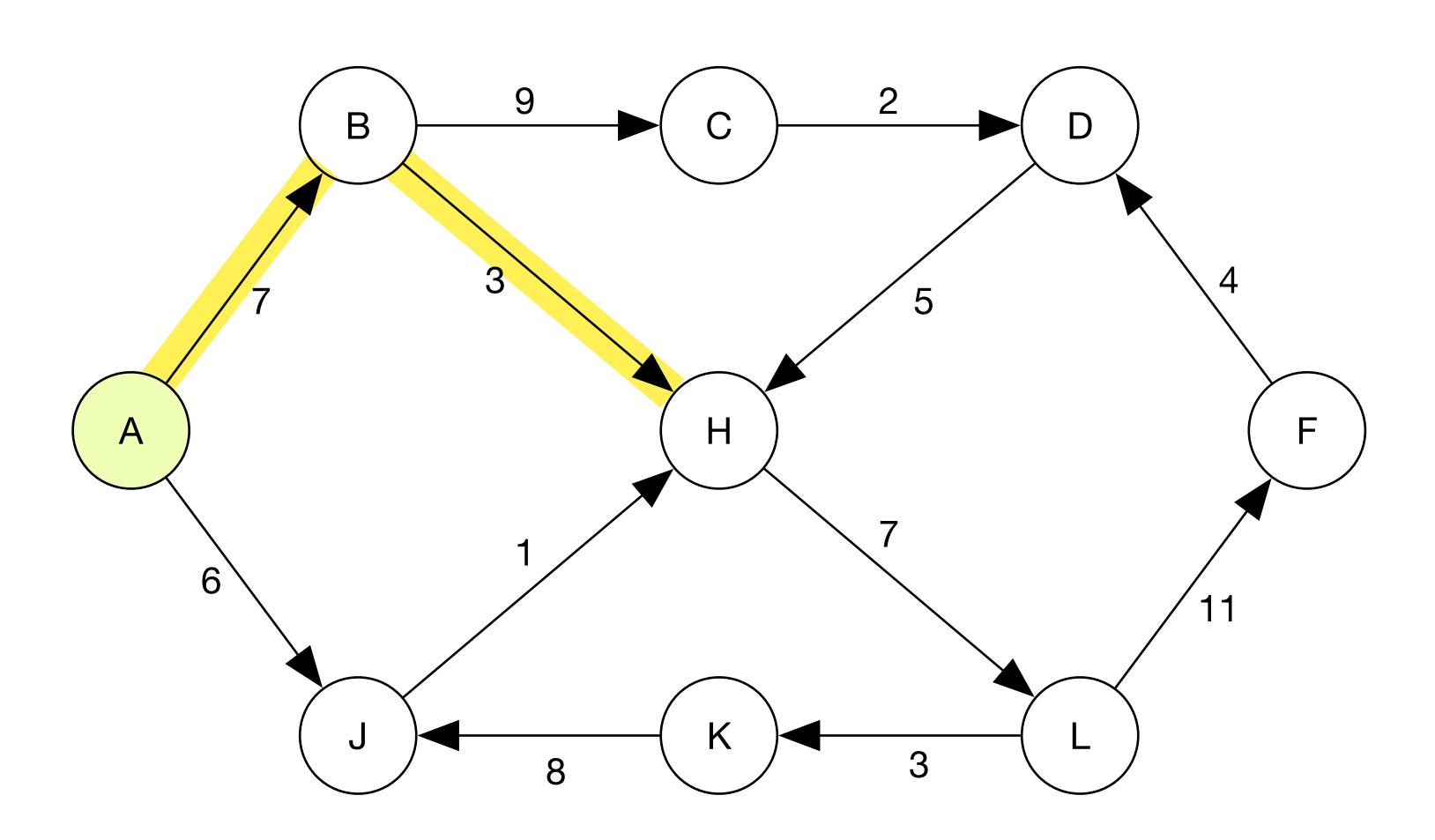


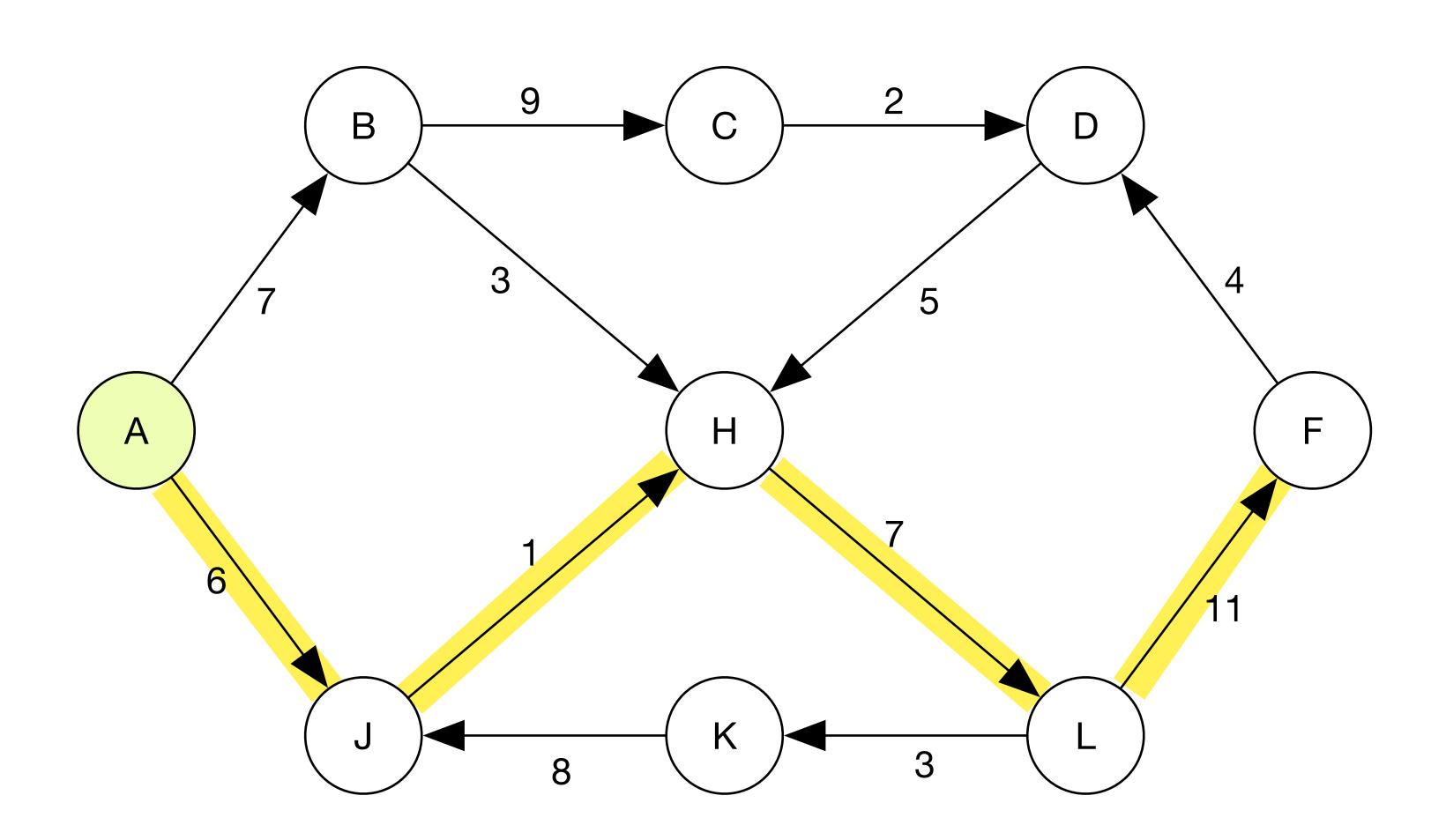


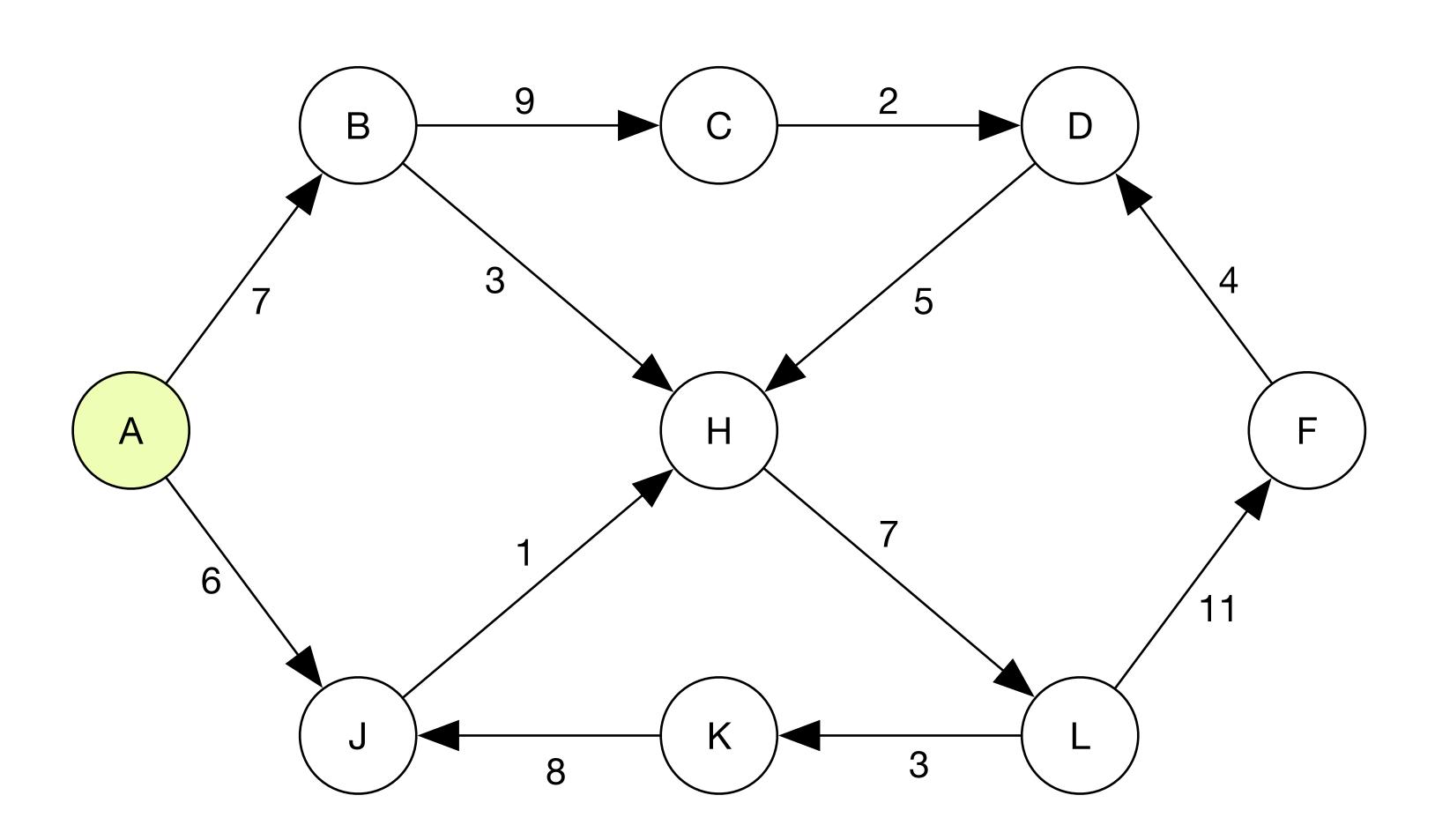




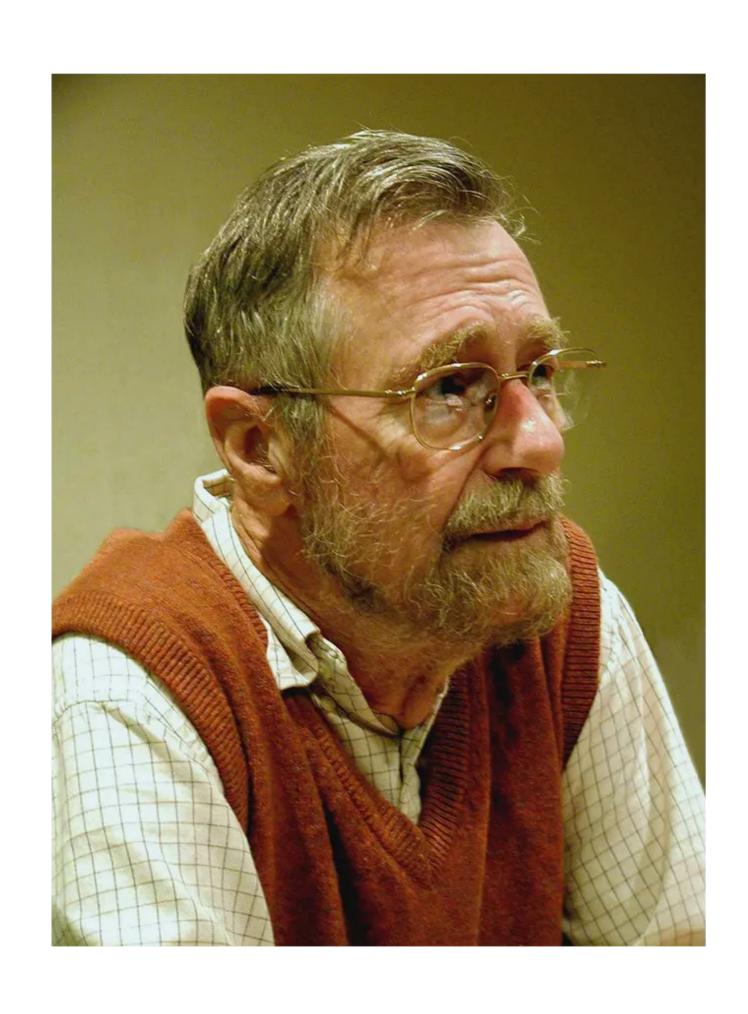








Shortest path: Dijkstra's algorithm

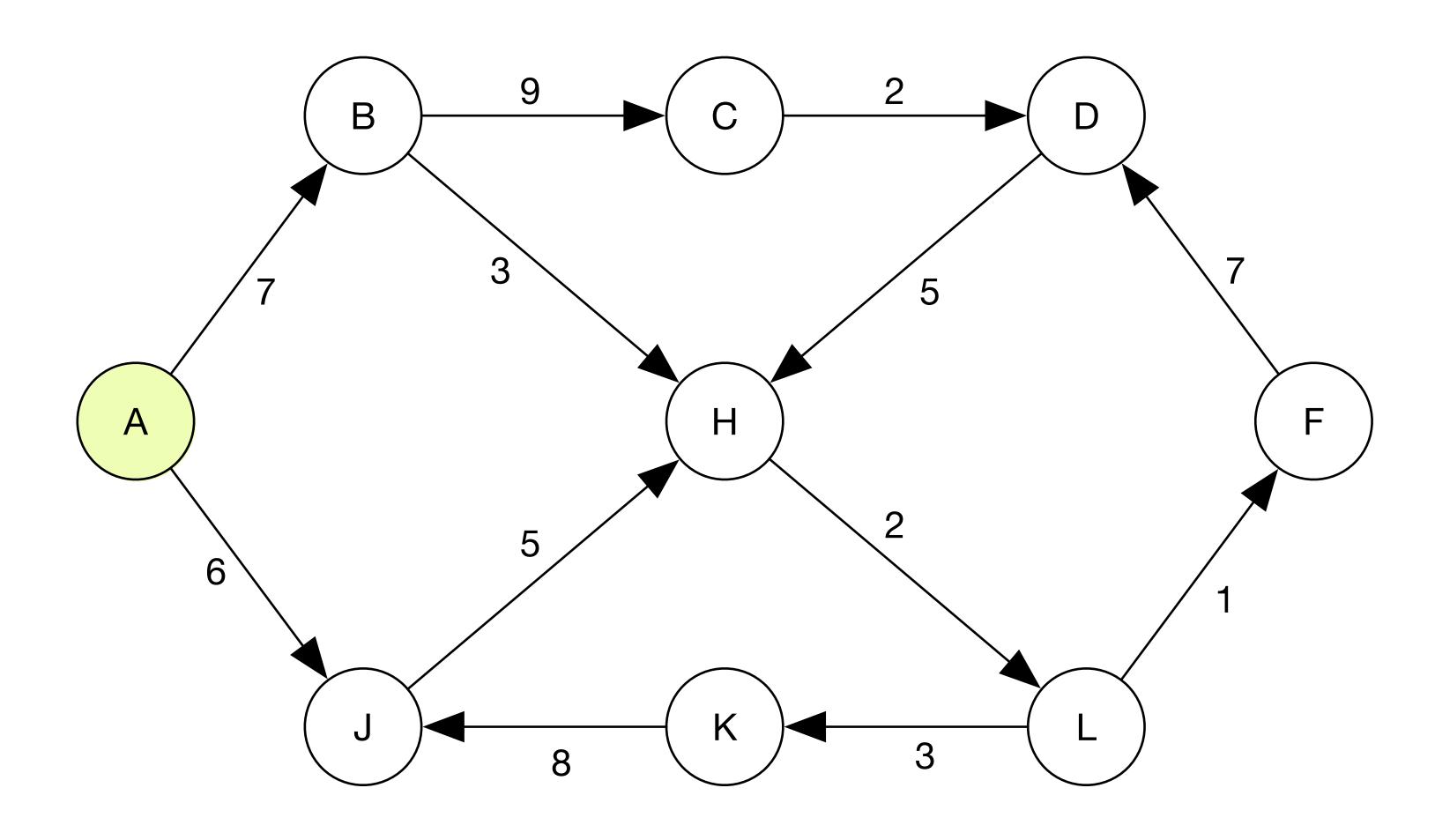


Dijkstra's algorithm

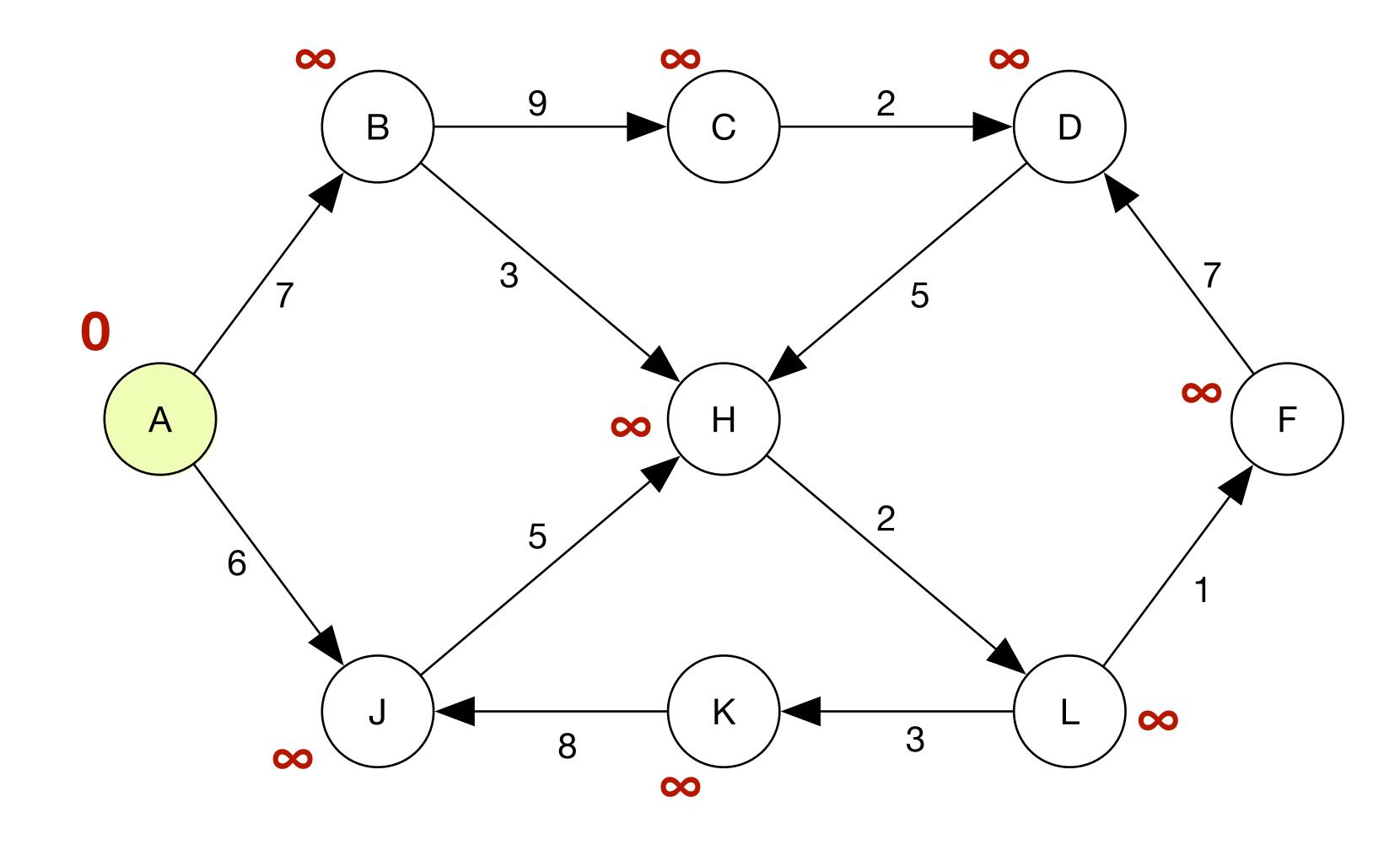
Given some graph, G = (V, E), and some starting node $S \in V$, Dijkstra's algorithm will find the shortest paths (or paths with minimum weight) from S to all other nodes in V.

Note that G must not contain any negative weight edges.

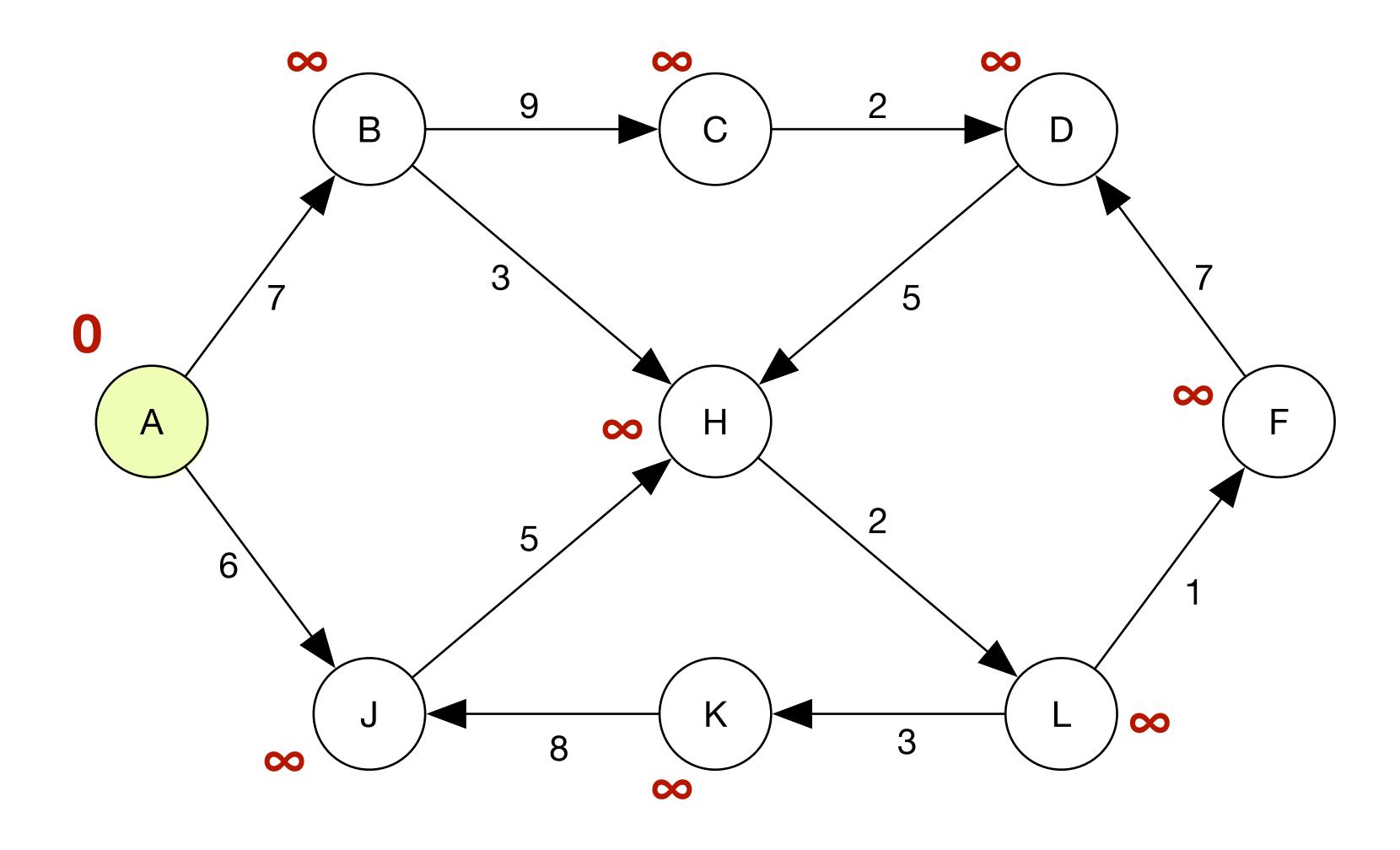
Mark all nodes as unvisited (add to set U)



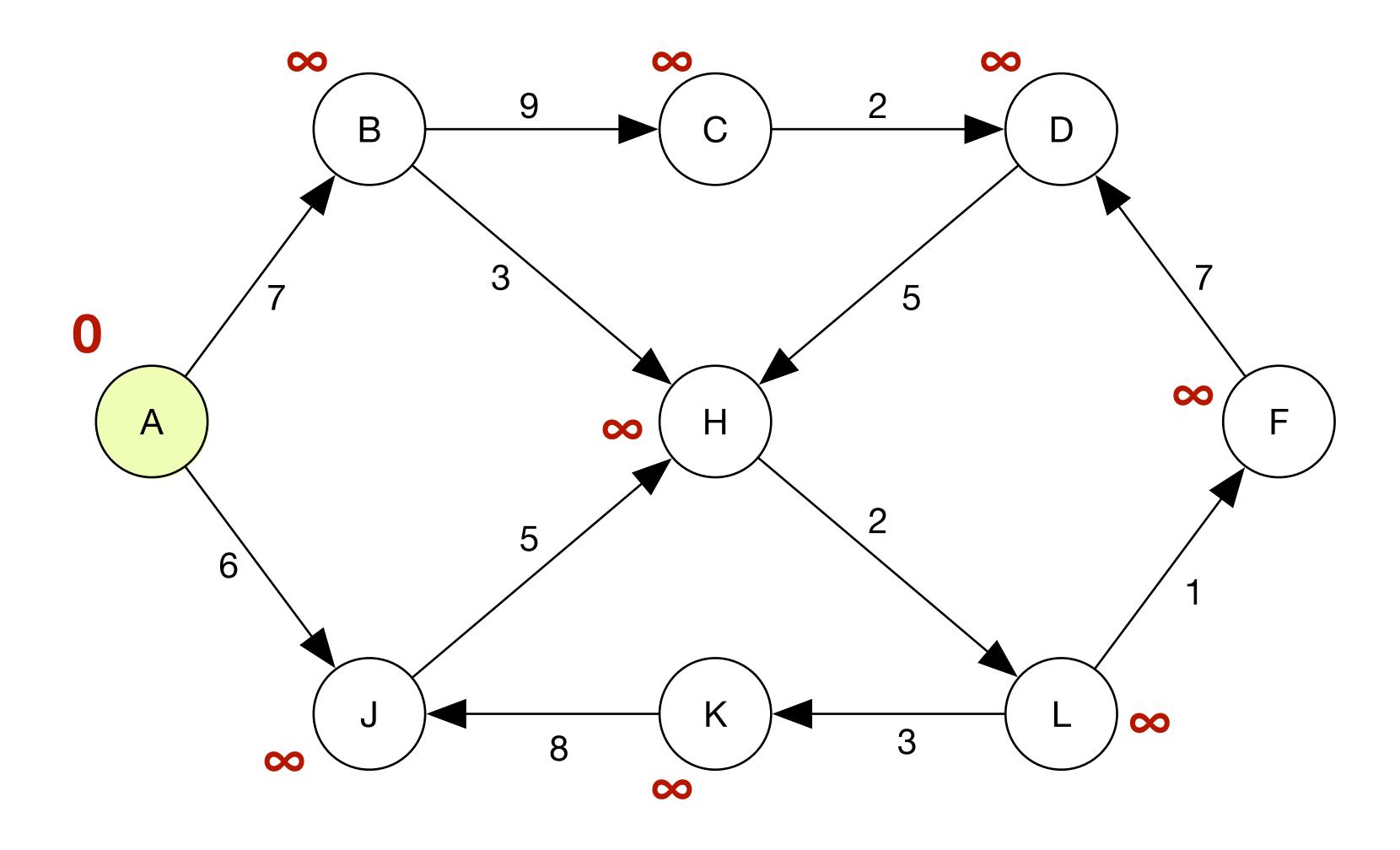
Initialize distances



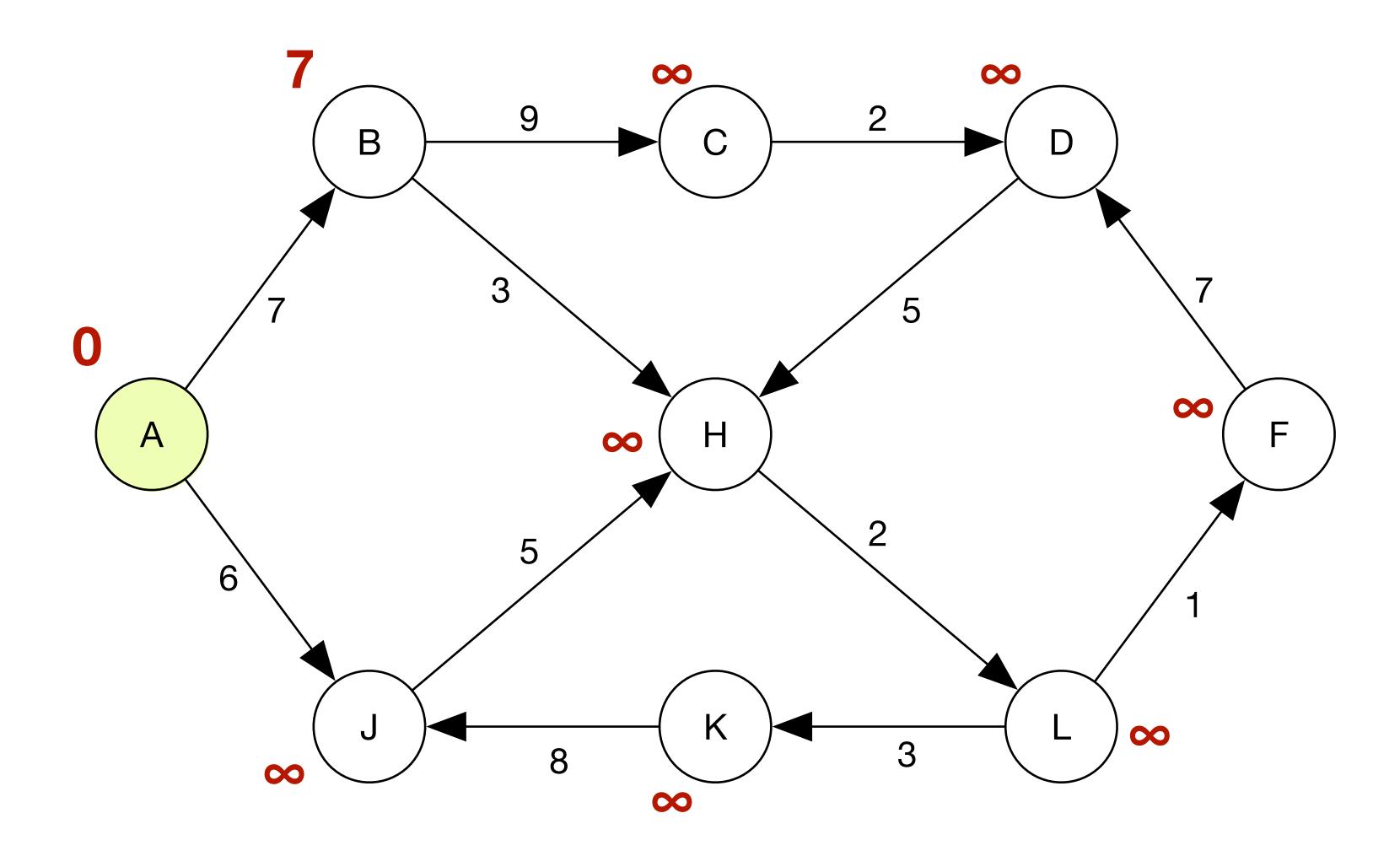
Calculate distances to unvisited neighbors



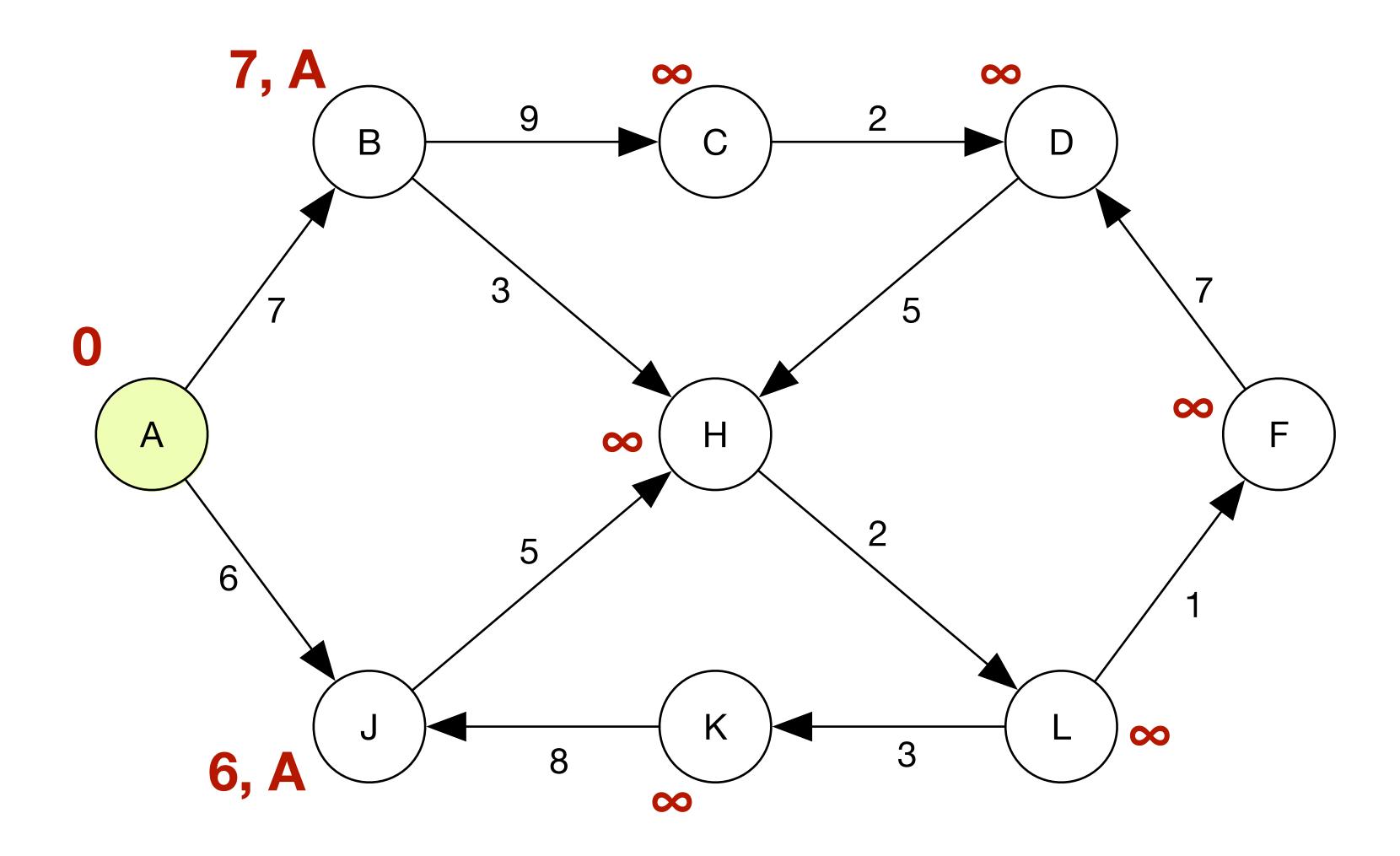
Calculate distances to unvisited neighbors



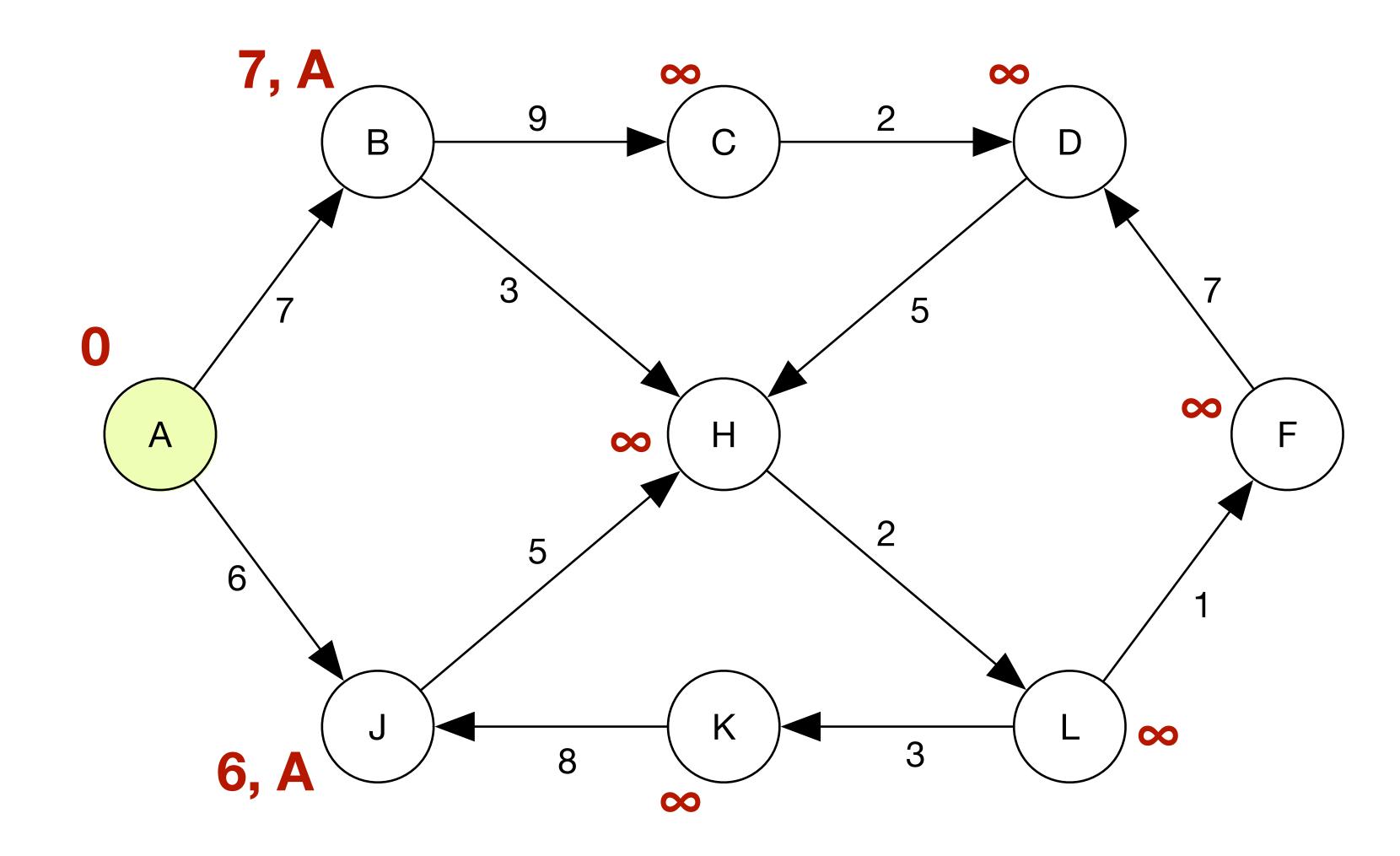
Calculate distances to unvisited neighbors



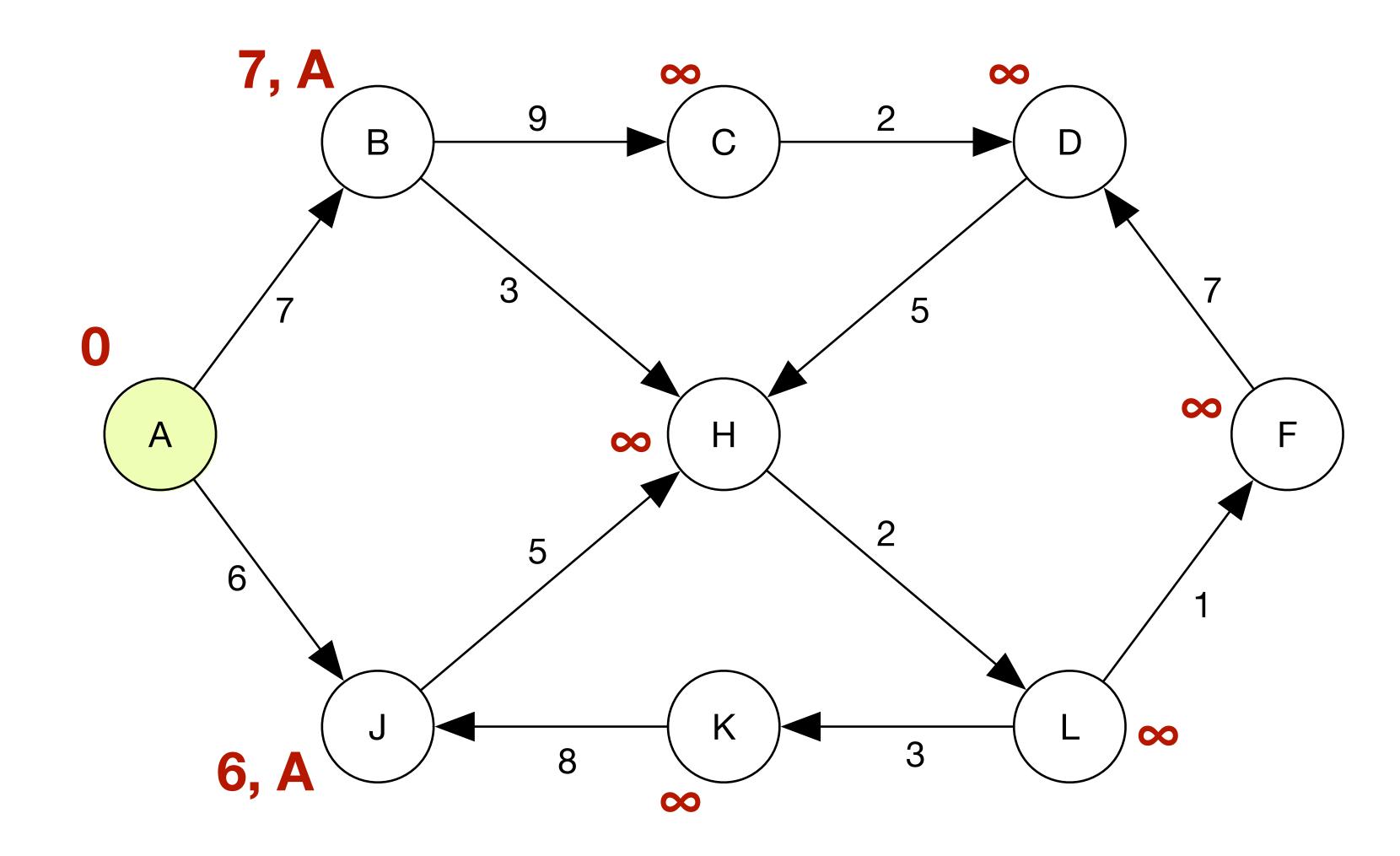
Calculate distances to unvisited neighbors



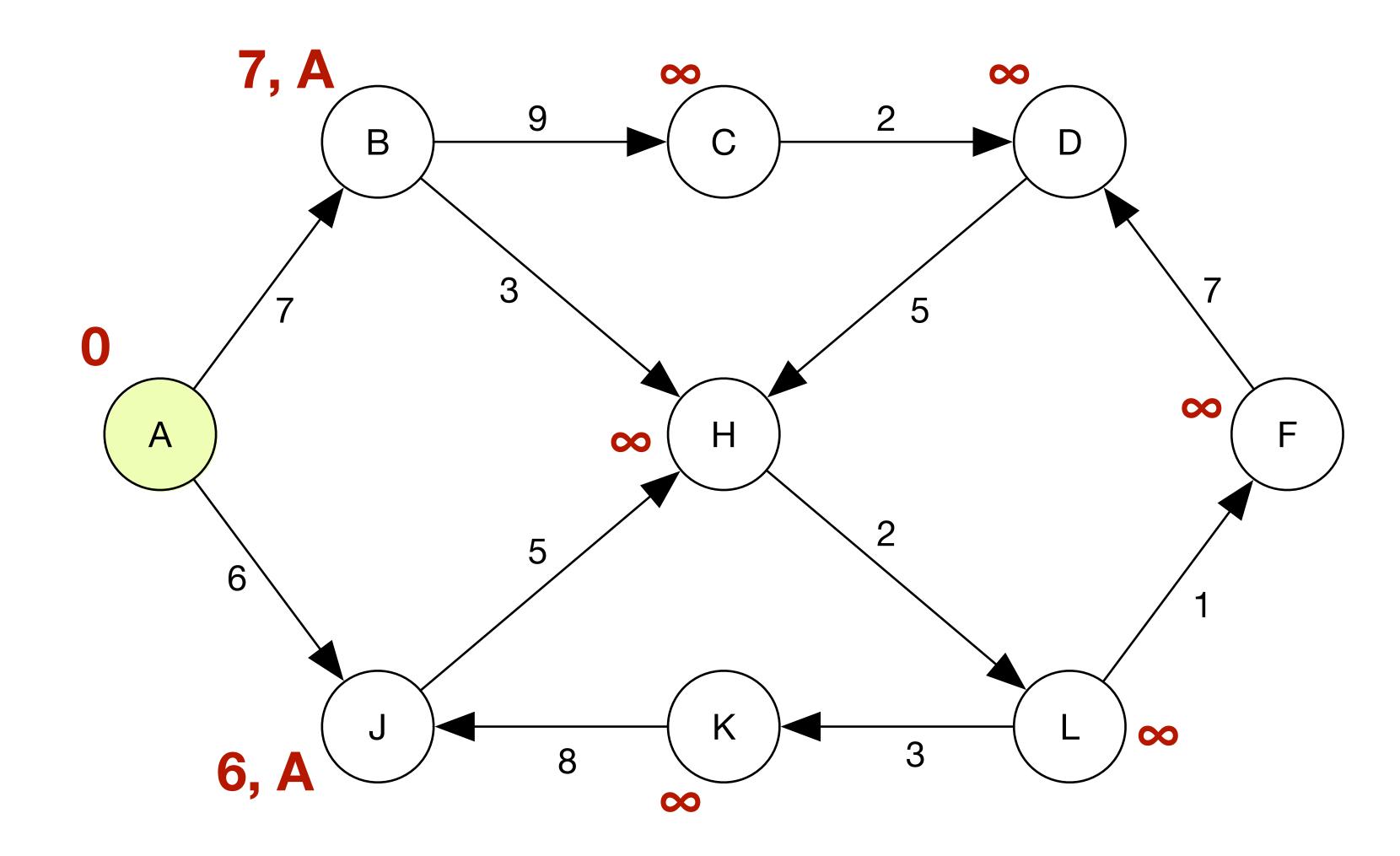
Mark A as visited (remove from U)



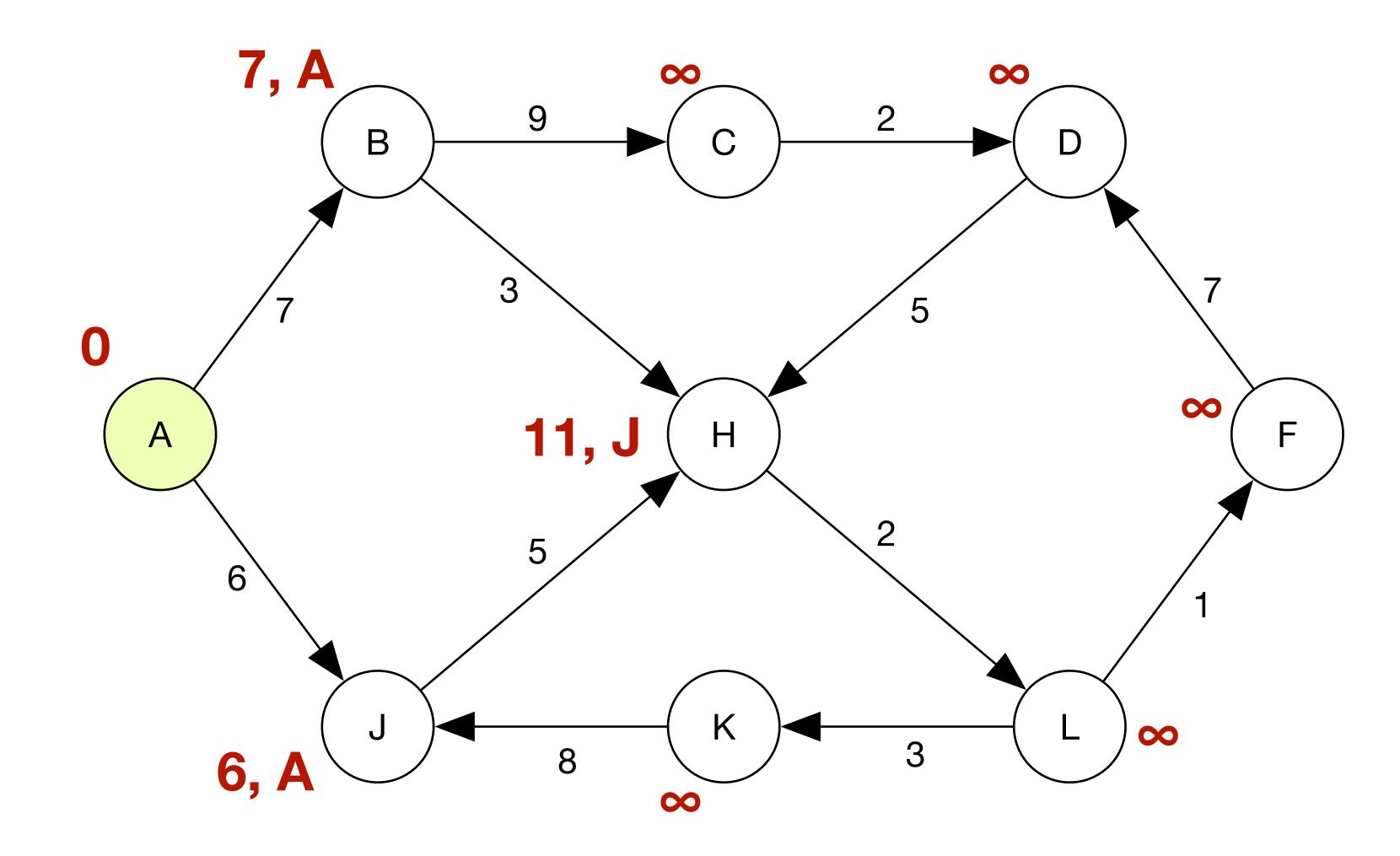
Choose next node from which to explore



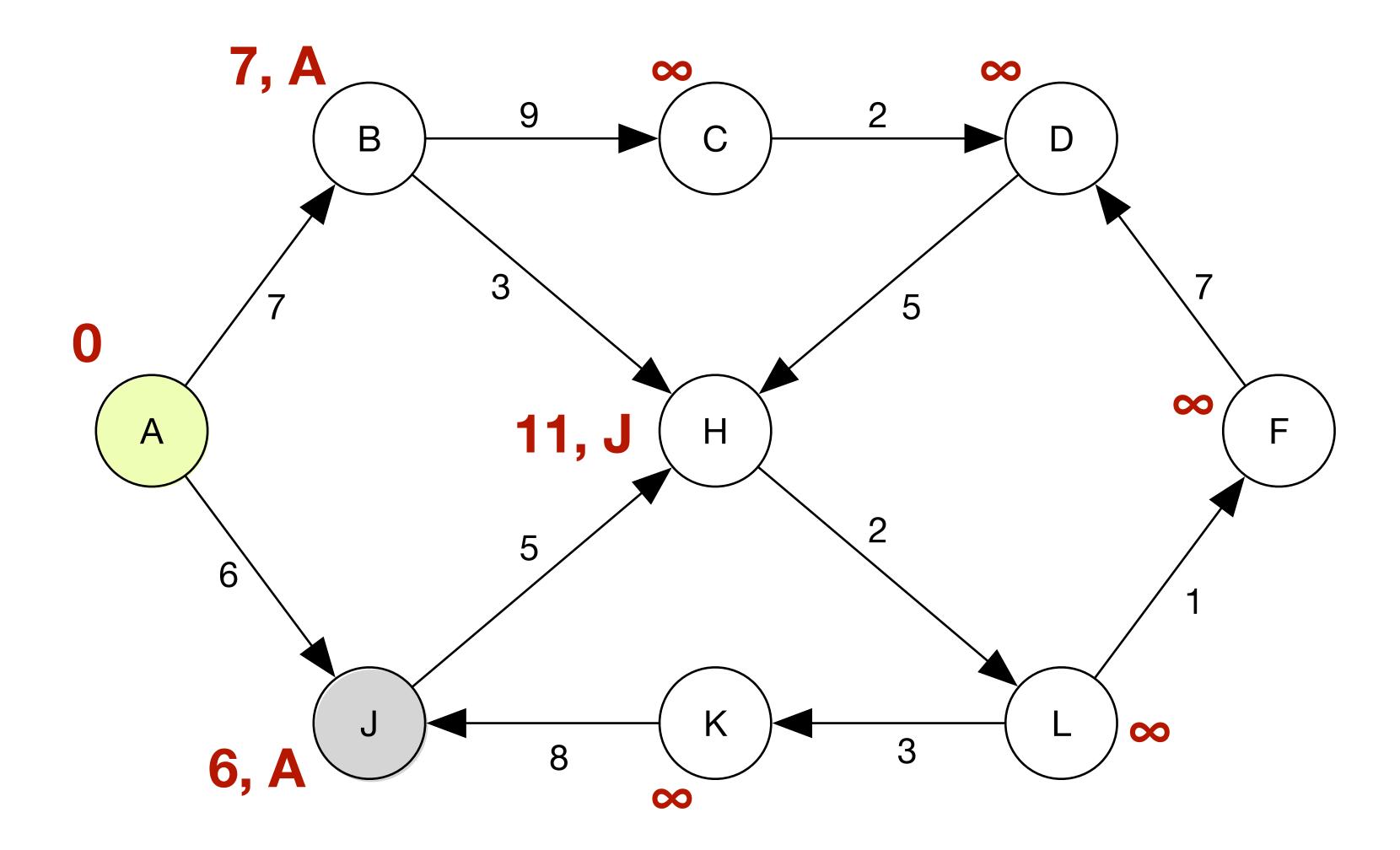
Explore from J, and calculate distances



Explore from J, and calculate distances

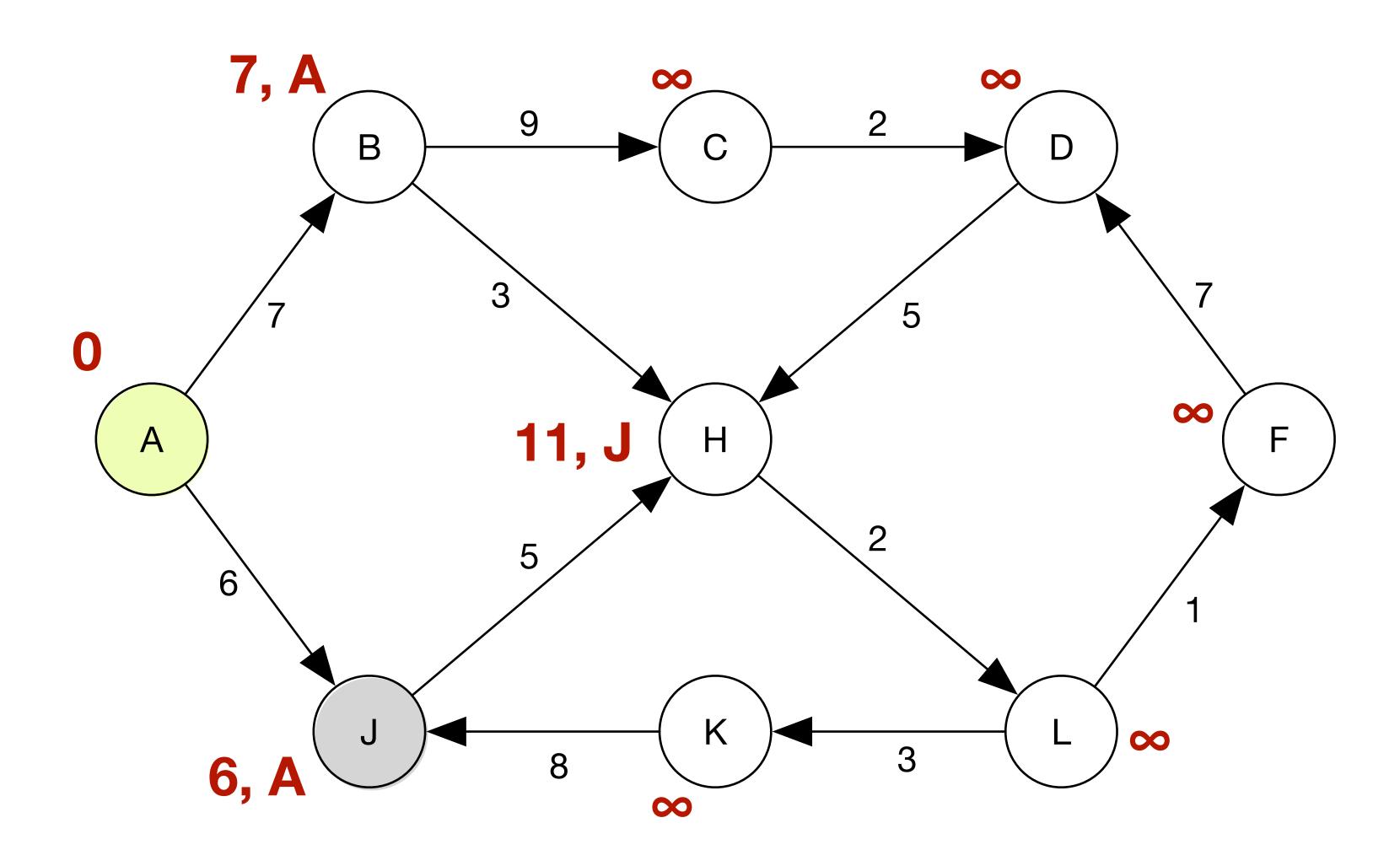


Mark J as visited (remove from set U)

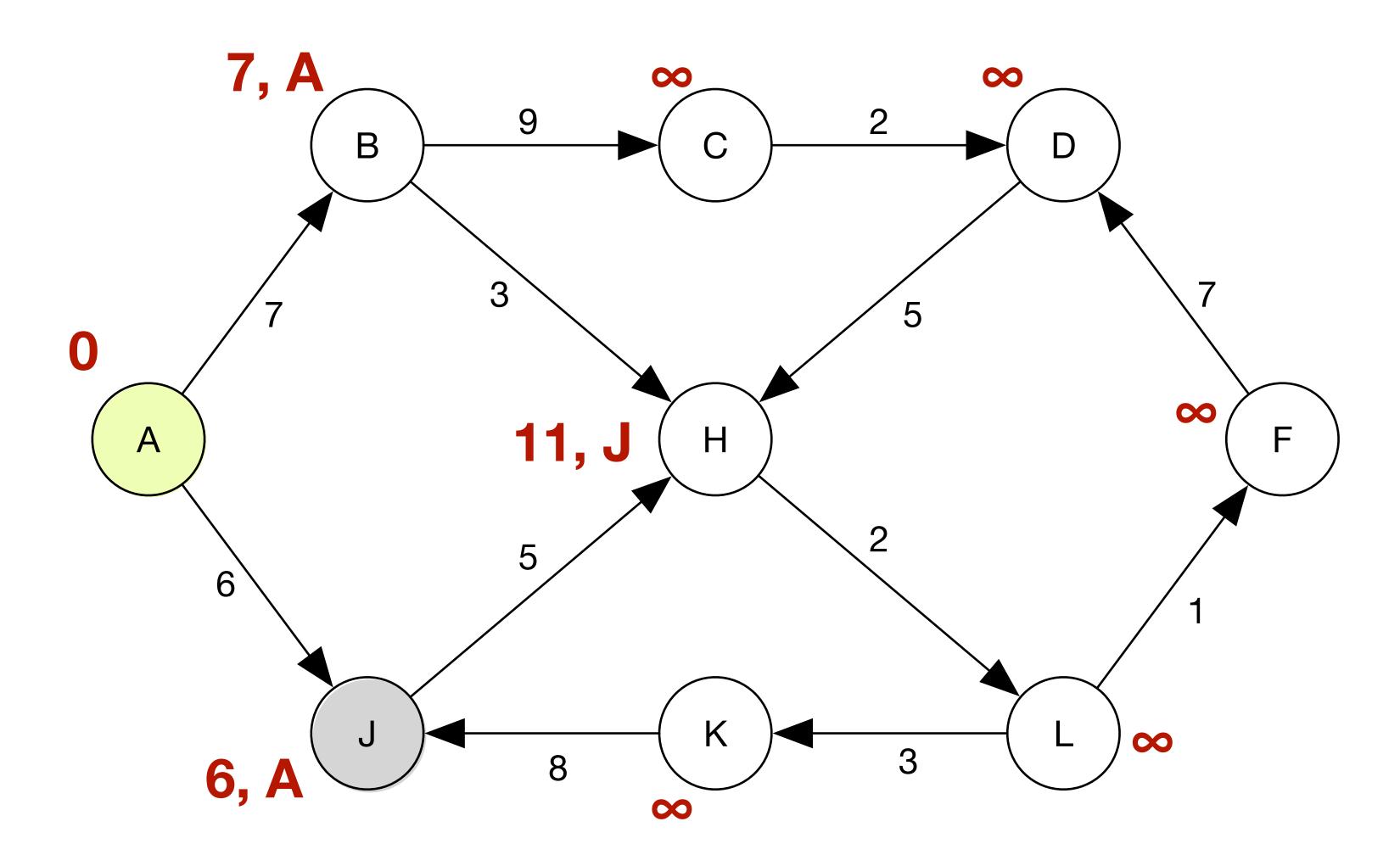


Unvisited set

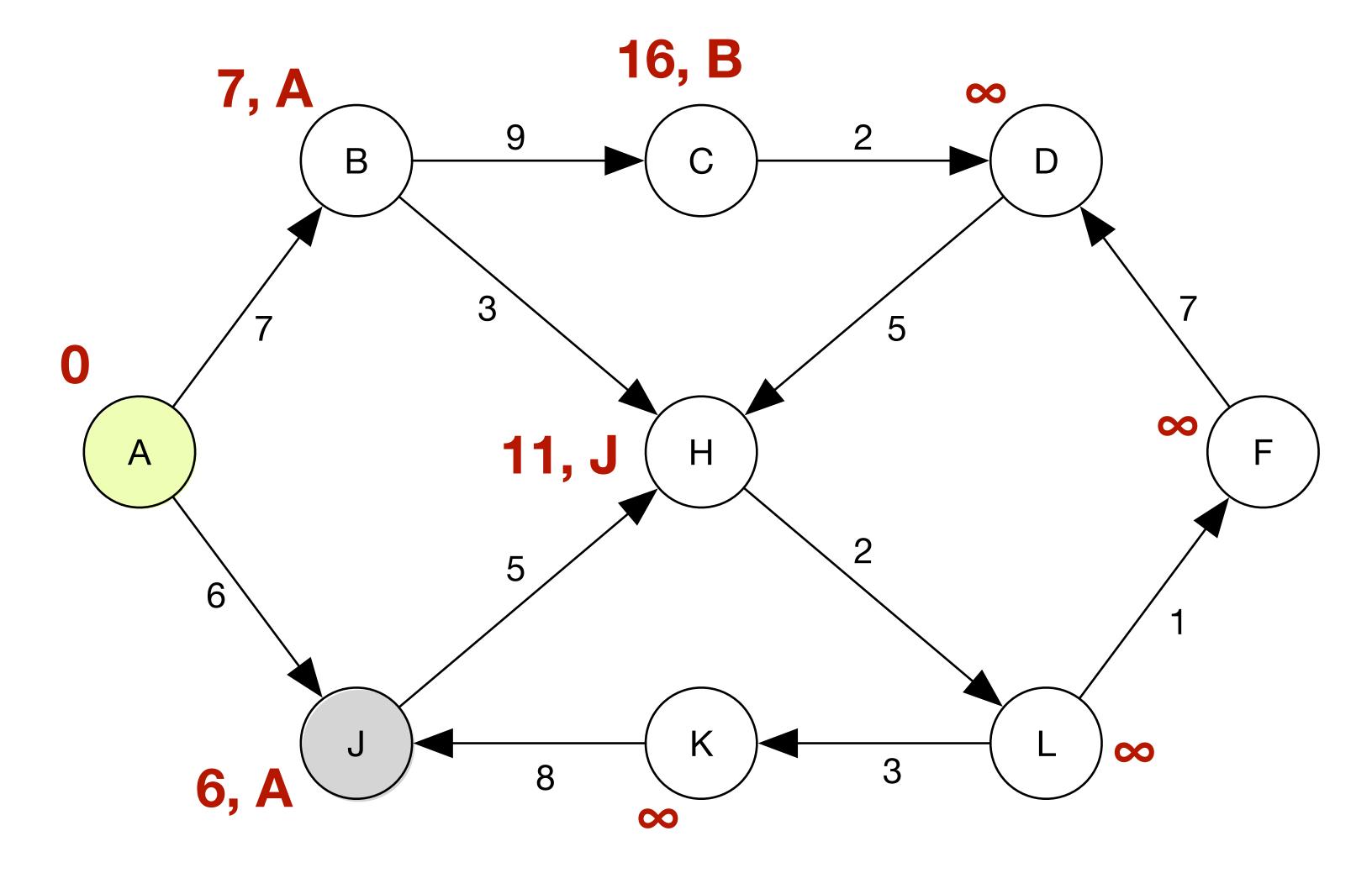
Choose next node from which to explore



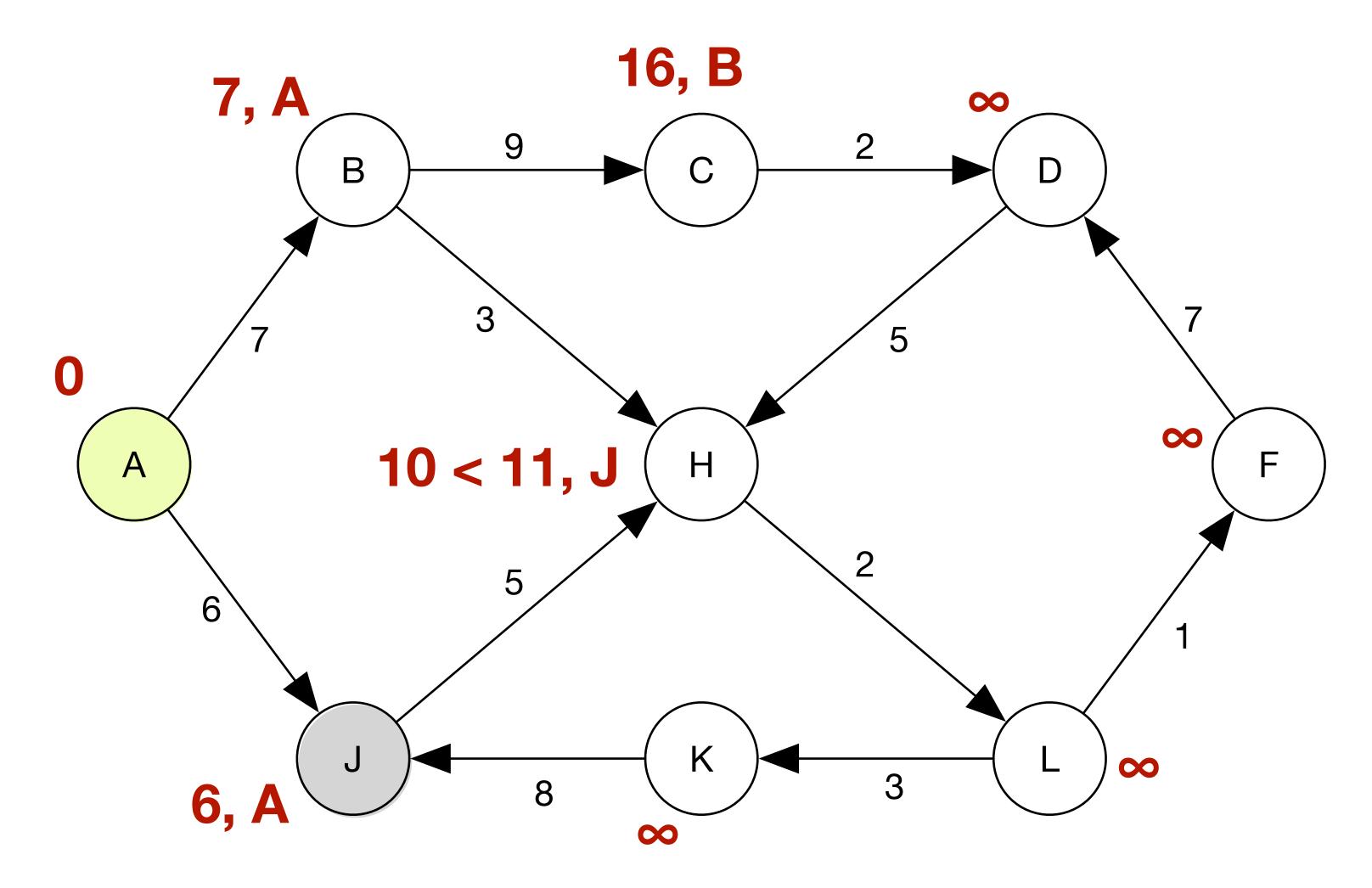
Unvisited set



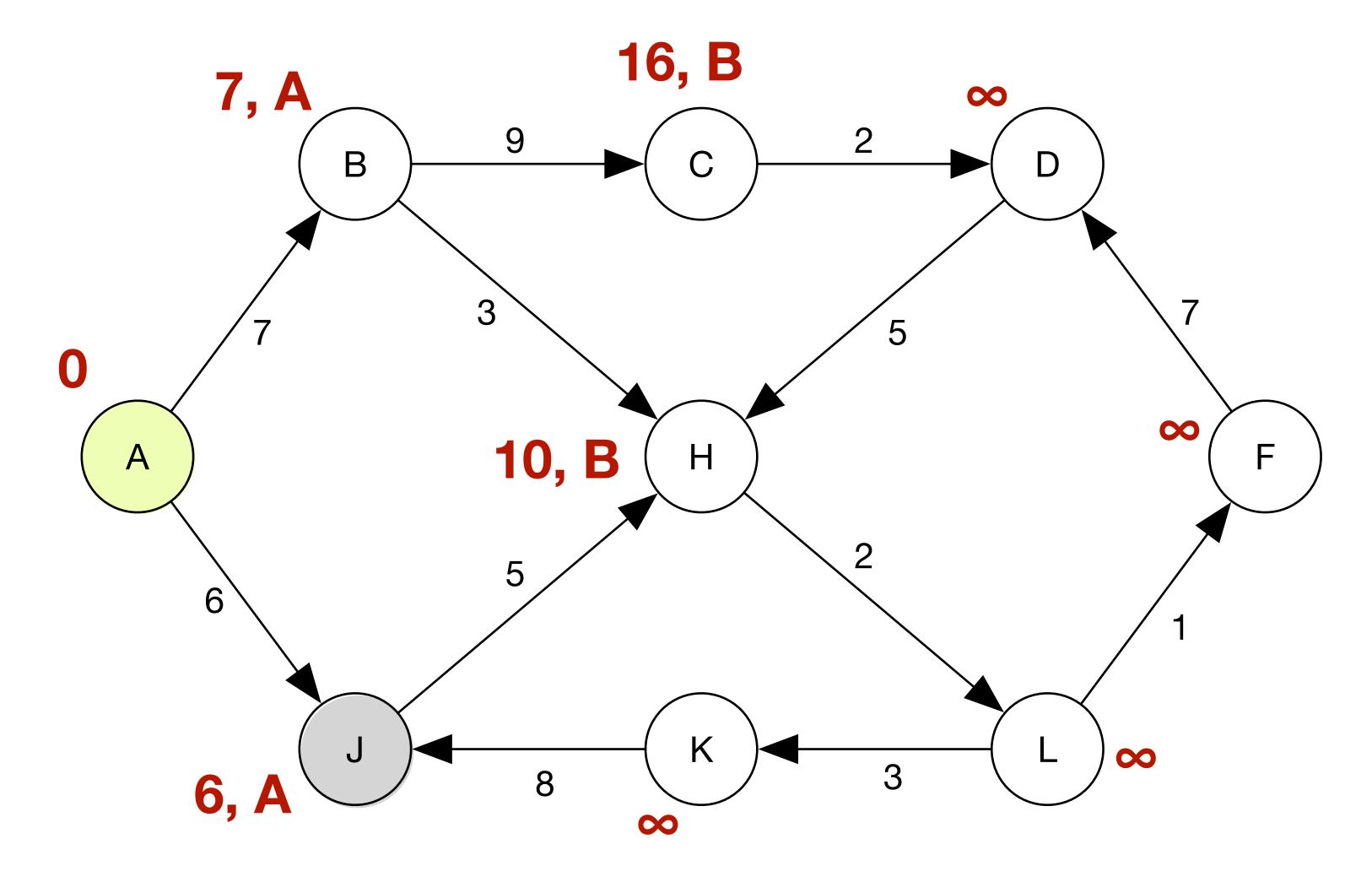
Unvisited set



Unvisited set



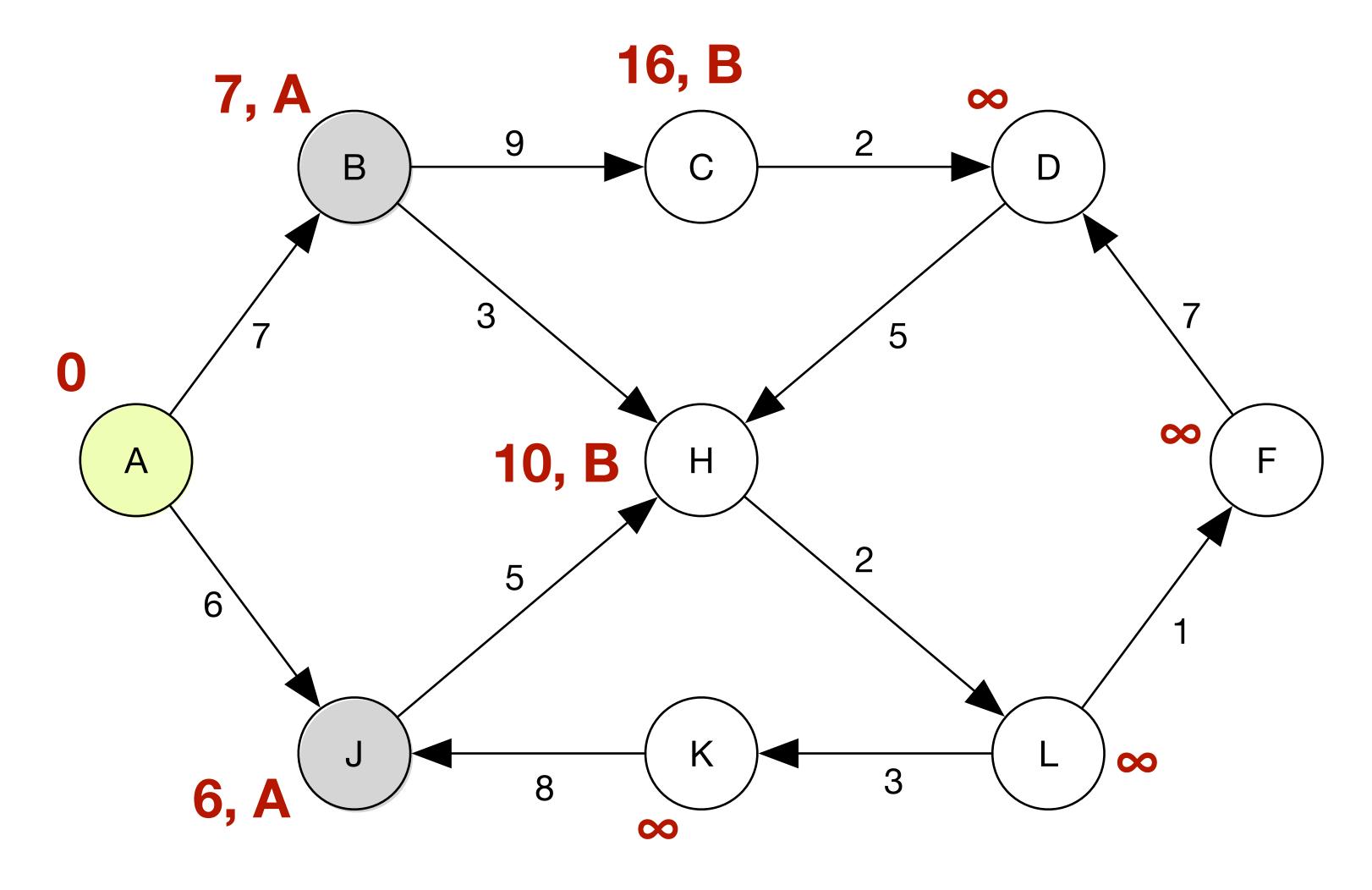
Unvisited set



Unvisited set

$$U = \{C, D, F, H, K, L\}$$

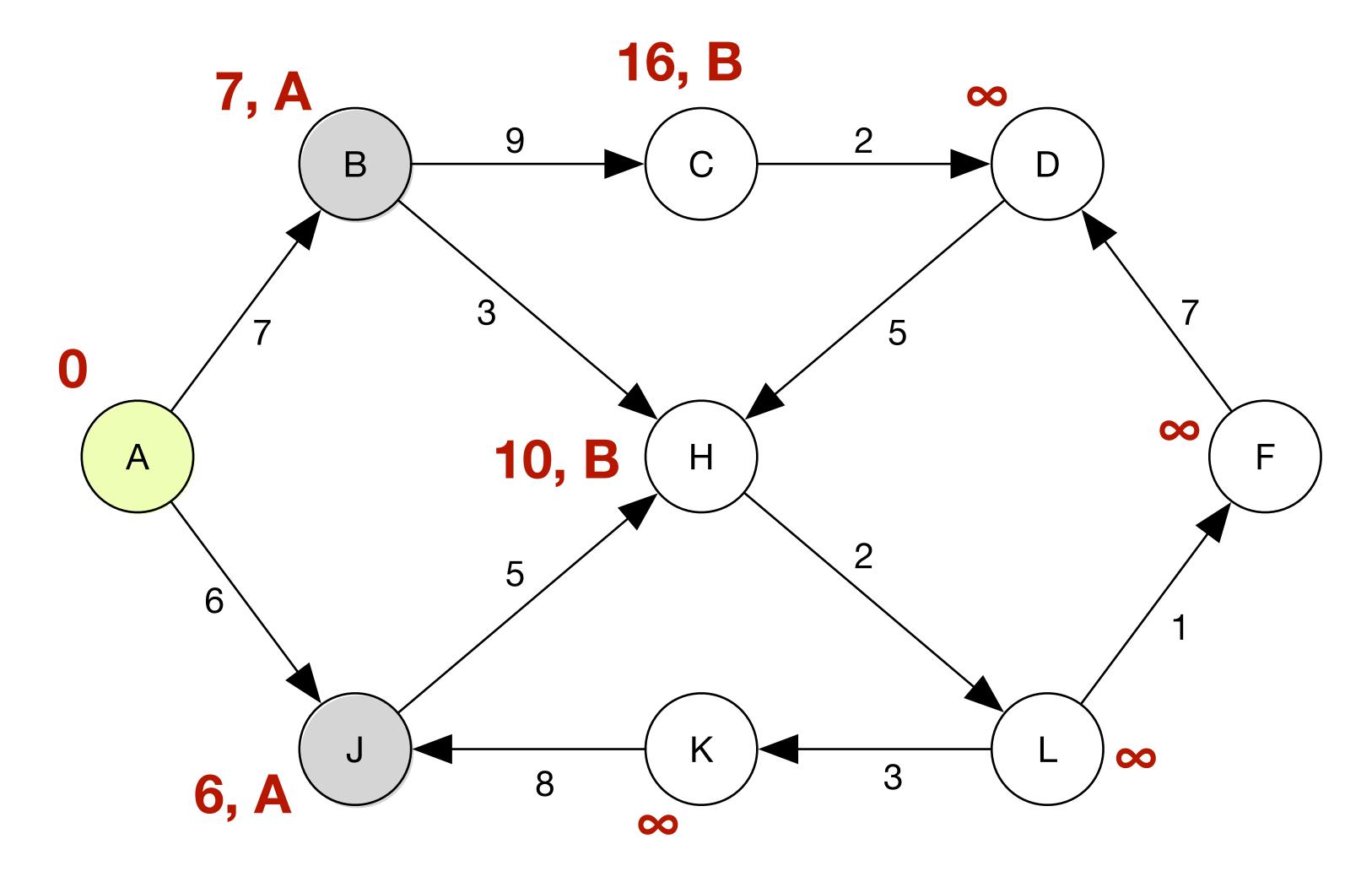
Mark B as visited (remove from set U)



Unvisited set

$$U = \{C, D, F, H, K, L\}$$

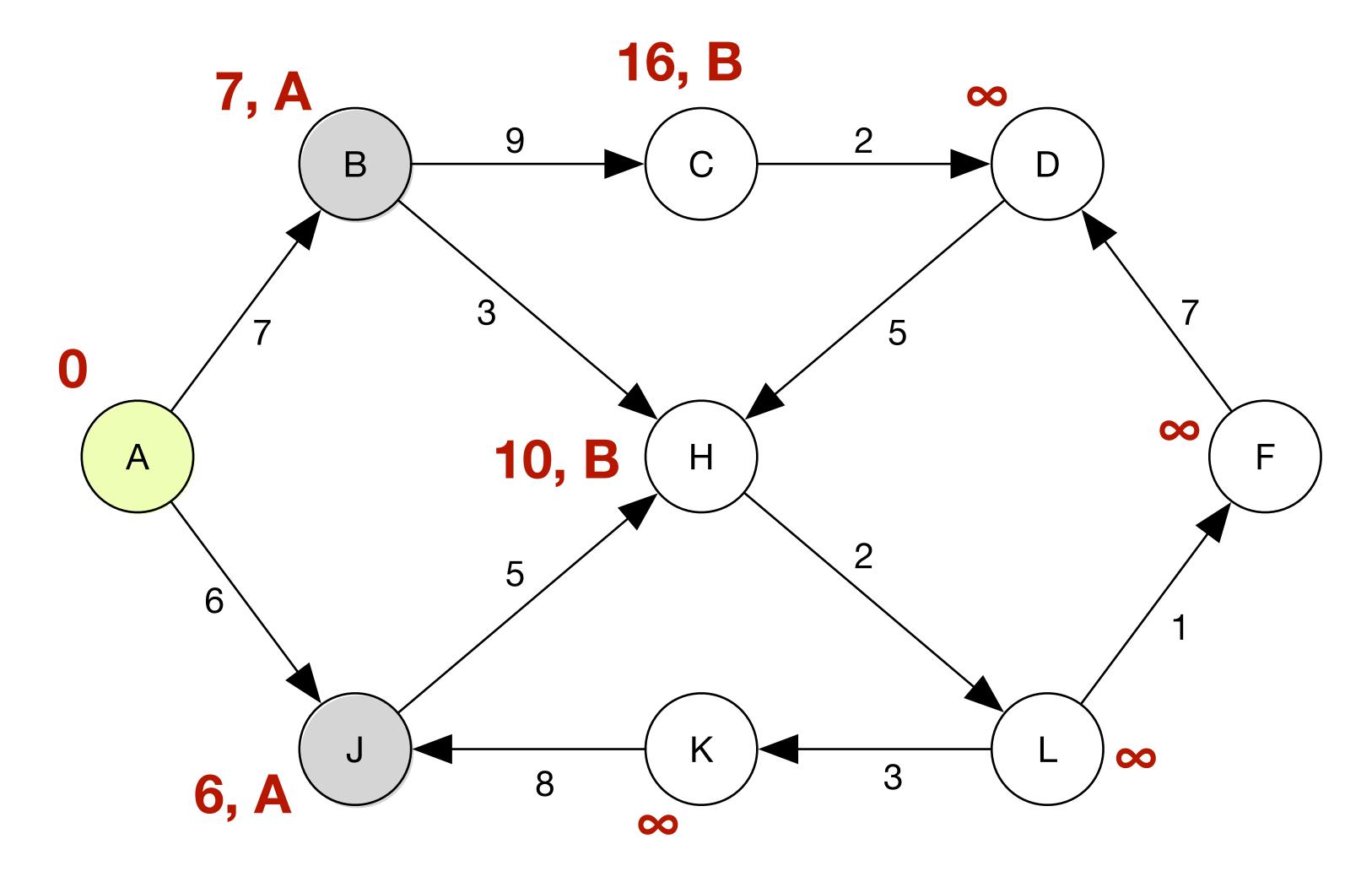
Choose the next node from which to explore



Unvisited set

$$U = \{C, D, F, H, K, L\}$$

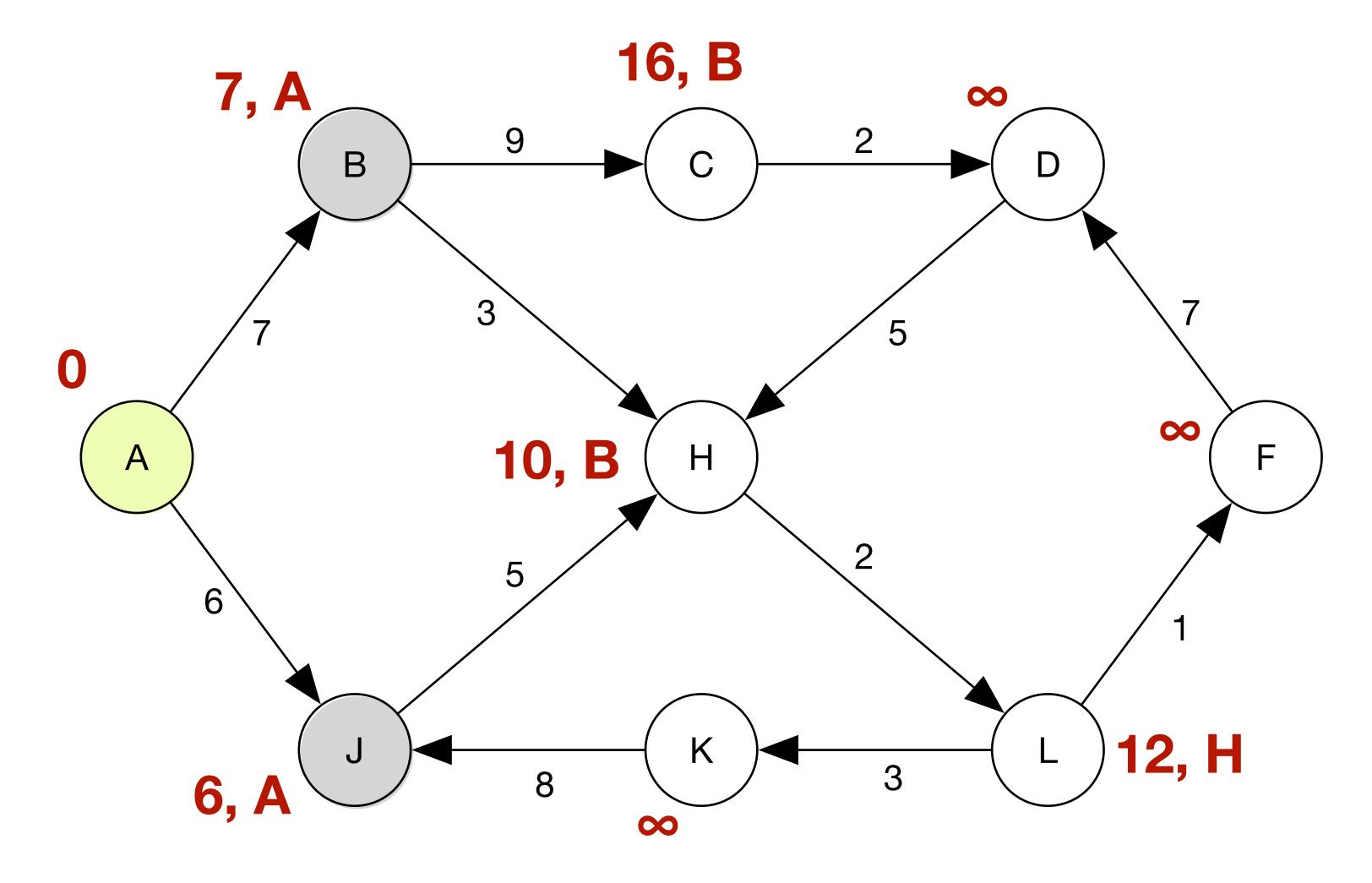
Explore from H and calculate distances



Unvisited set

$$U = \{C, D, F, H, K, L\}$$

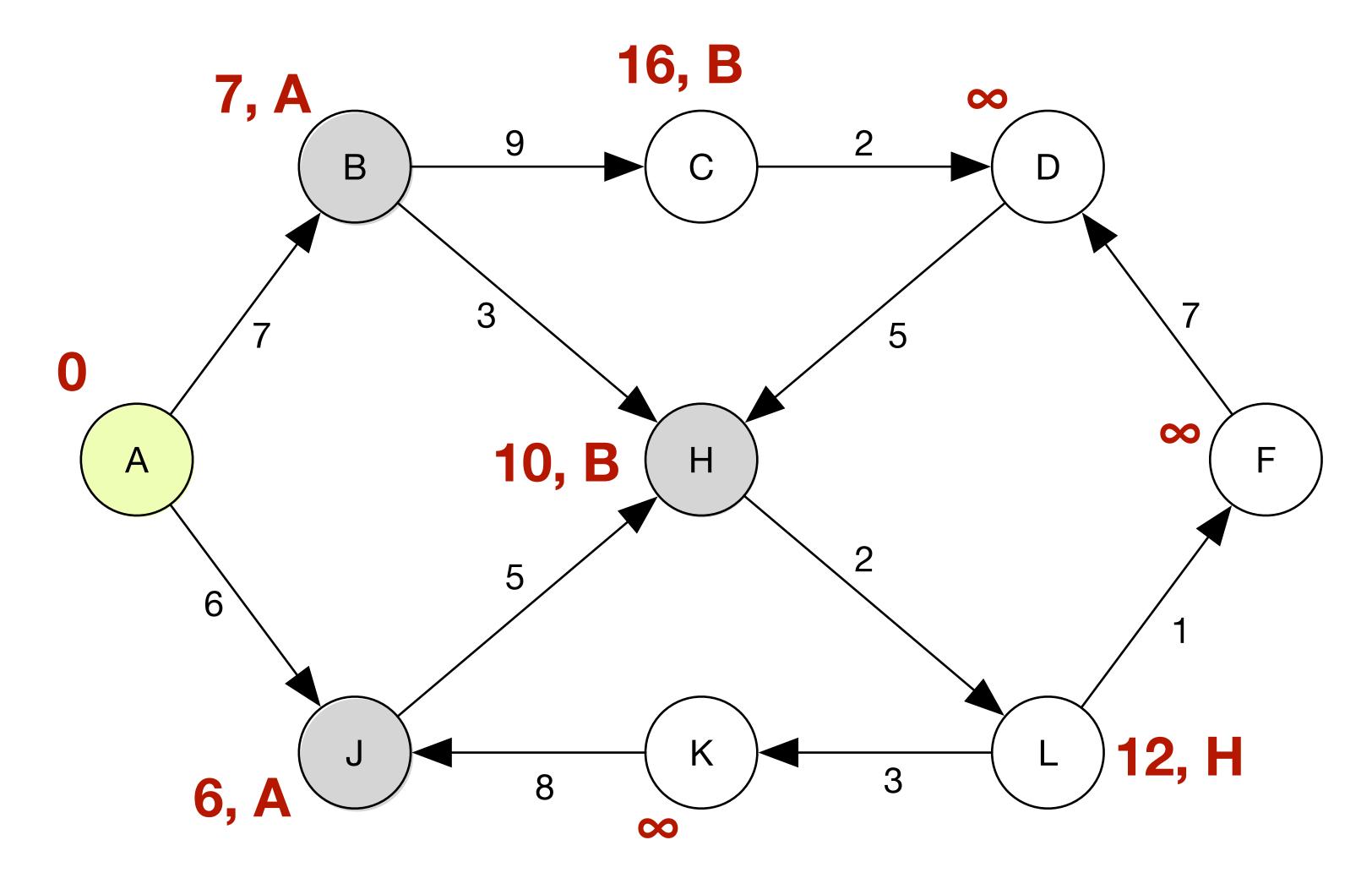
Explore from H and calculate distances



Unvisited set

$$U = \{C, D, F, K, L\}$$

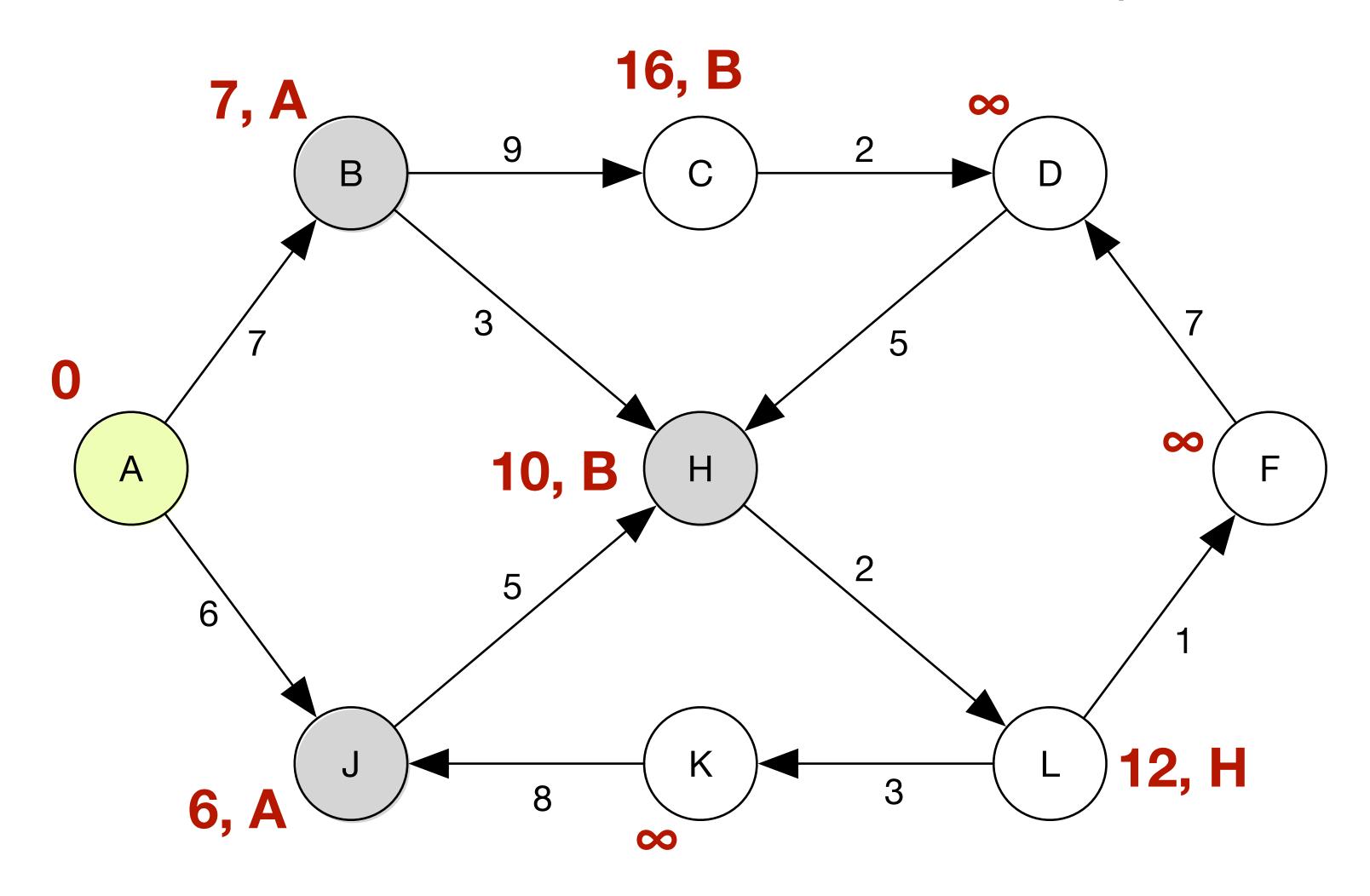
Mark H as visited (remove from set U)



Unvisited set

$$U = \{C, D, F, K, L\}$$

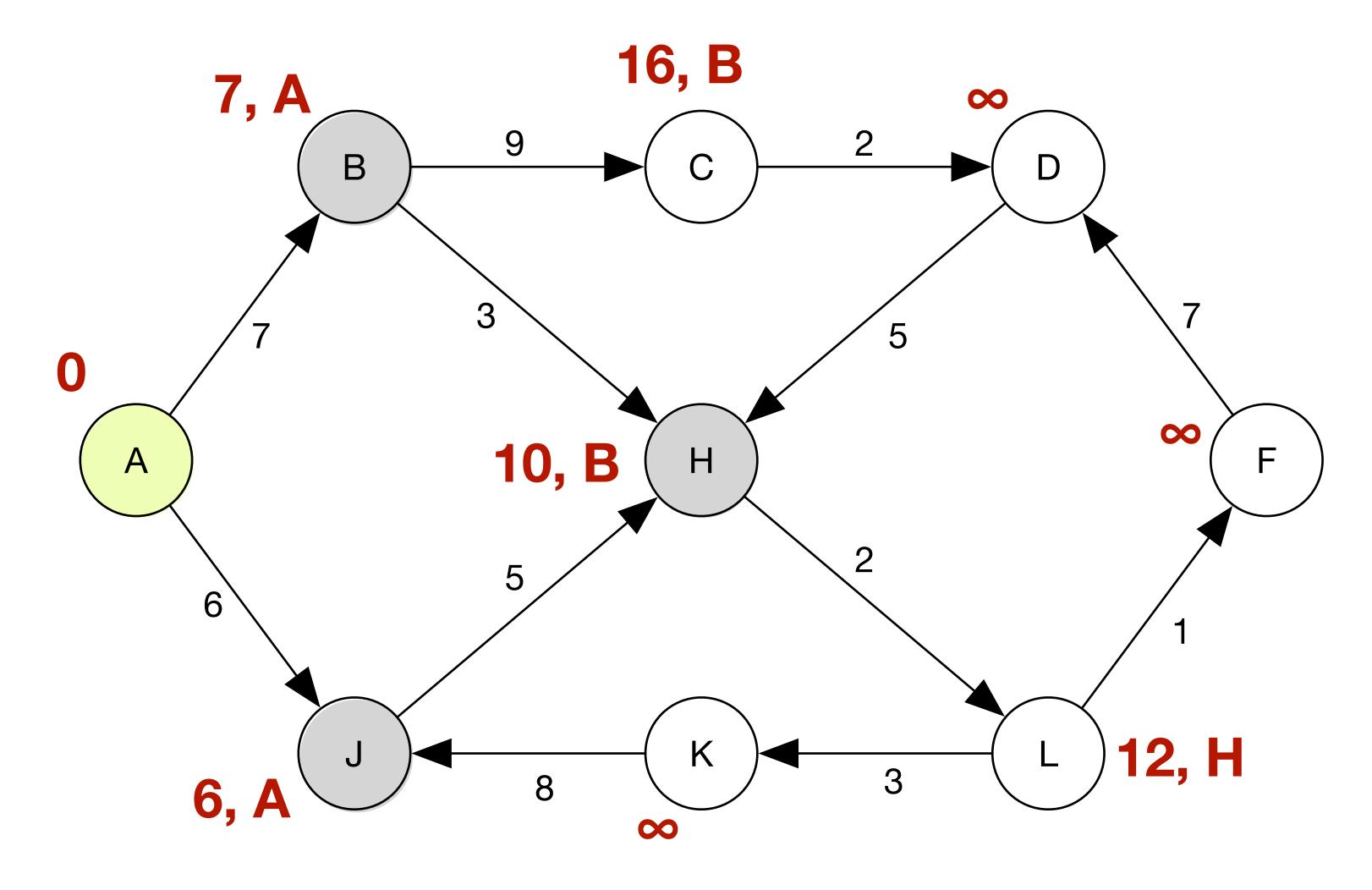
Choose next node from which to explore



Unvisited set

$$U = \{C, D, F, K, L\}$$

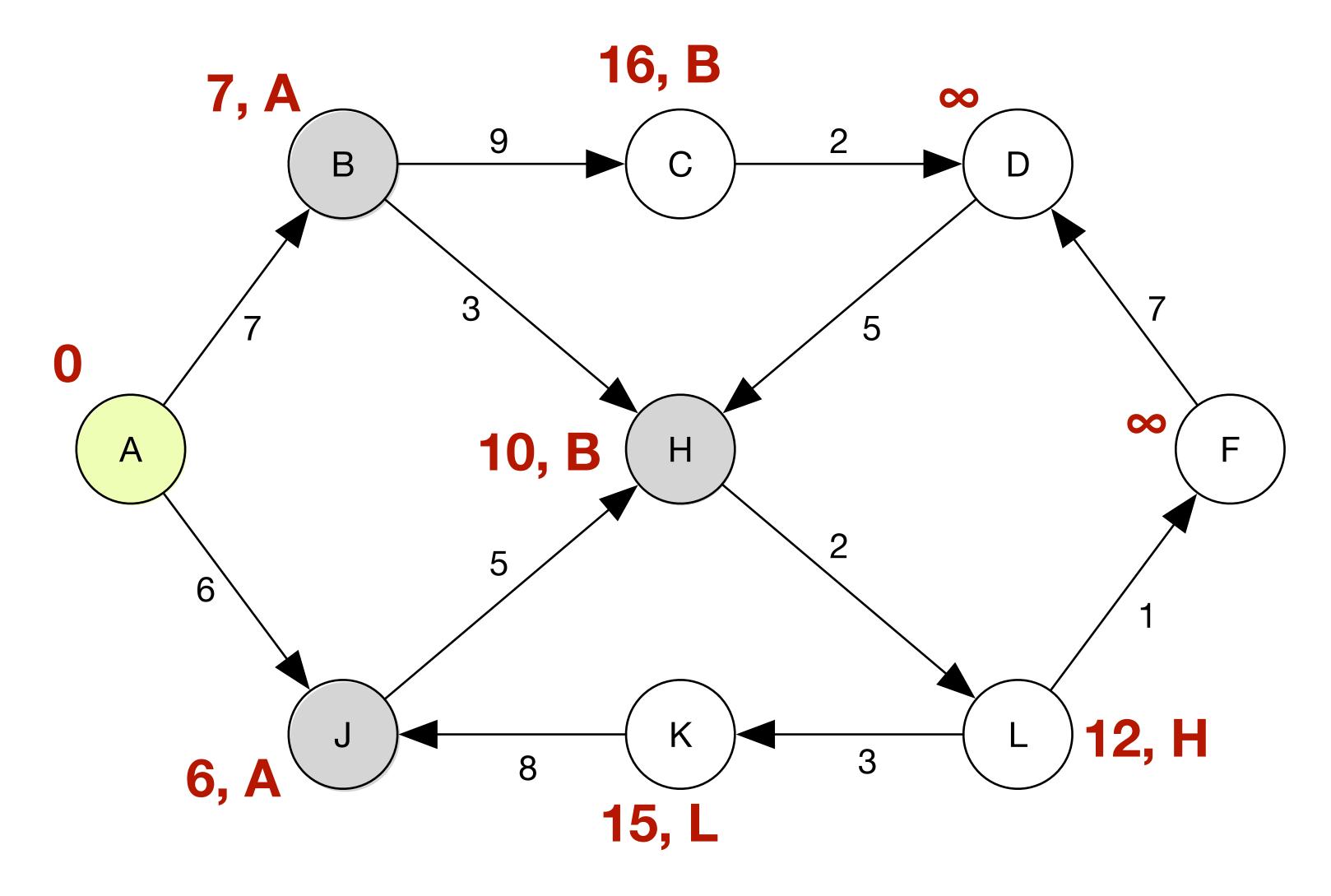
Explore from L and calculate distances



Unvisited set

$$U = \{C, D, F, K, L\}$$

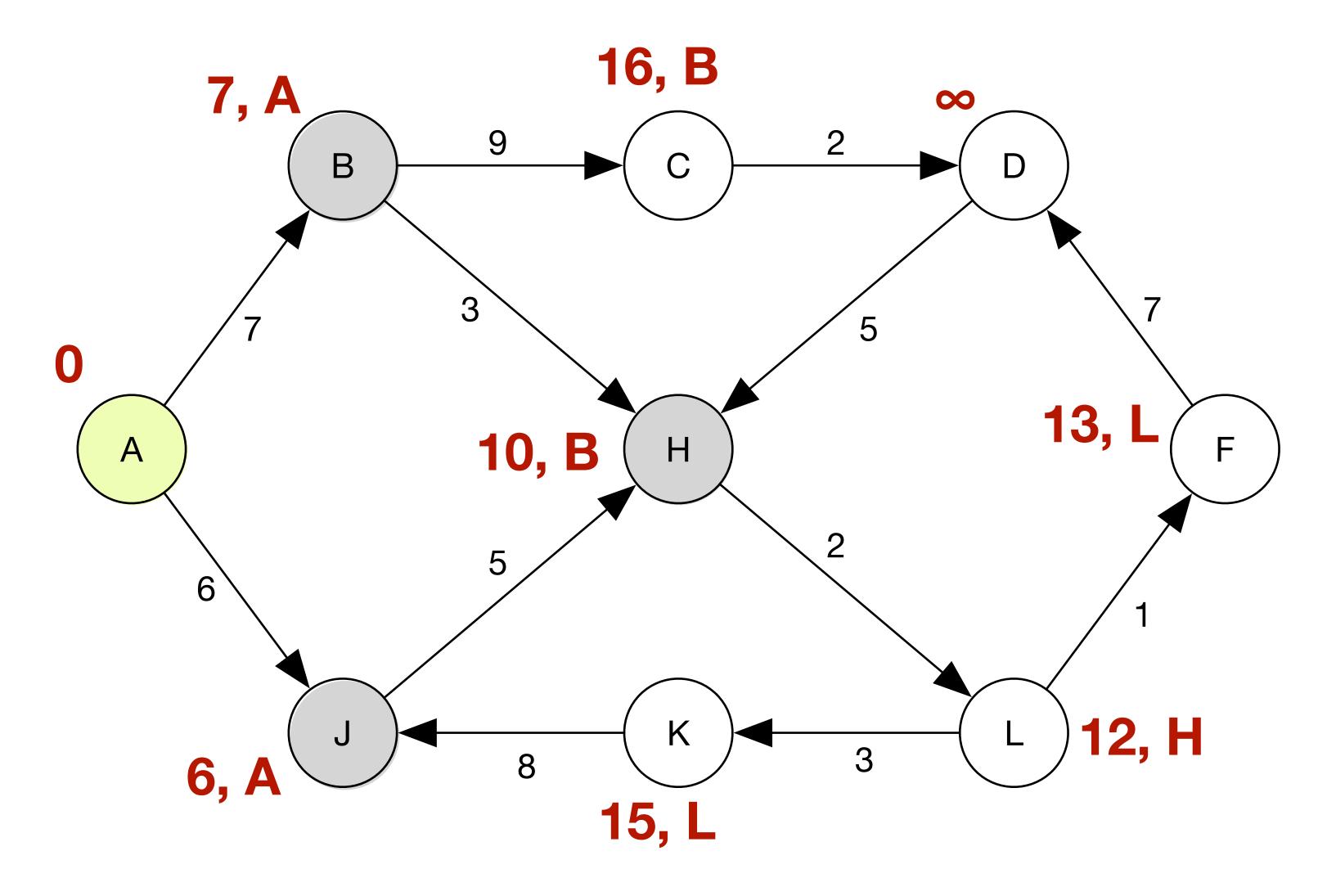
Explore from L and calculate distances



Unvisited set

$$U = \{C, D, F, K, L\}$$

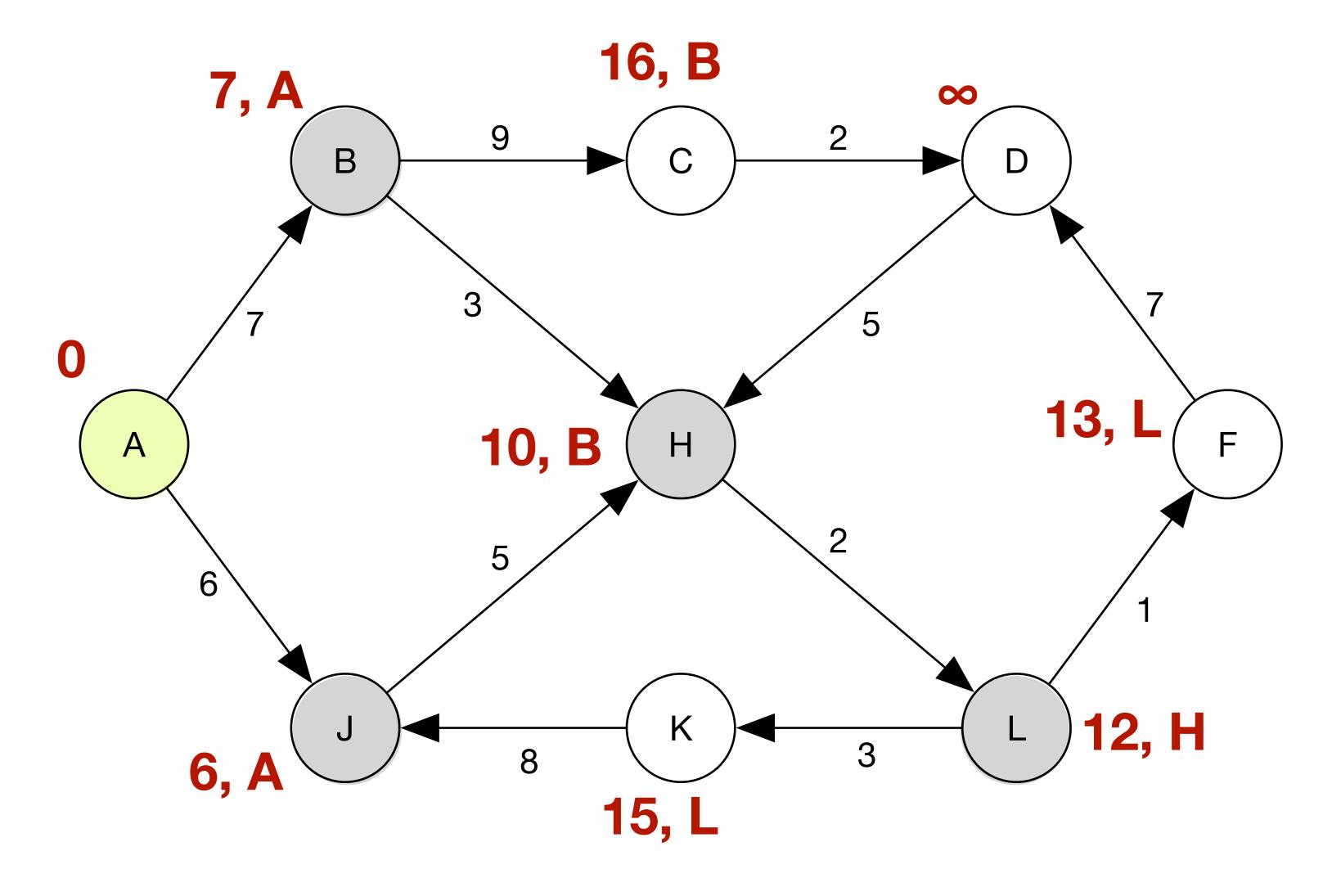
Explore from L and calculate distances



Unvisited set

$$U = \{C, D, F, K\}$$

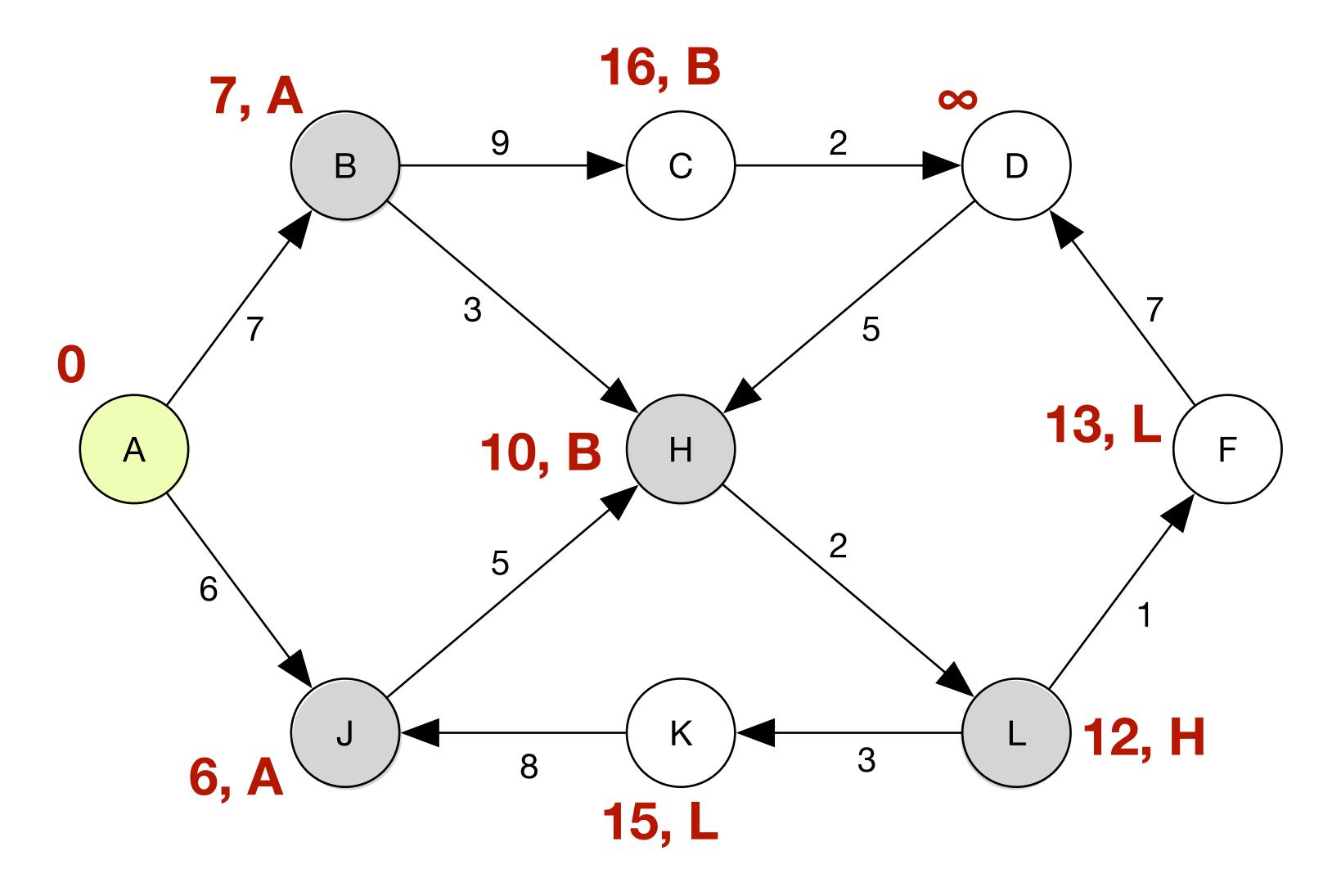
Mark L as visited (remove from set U)



Unvisited set

$$U = \{C, D, F, K\}$$

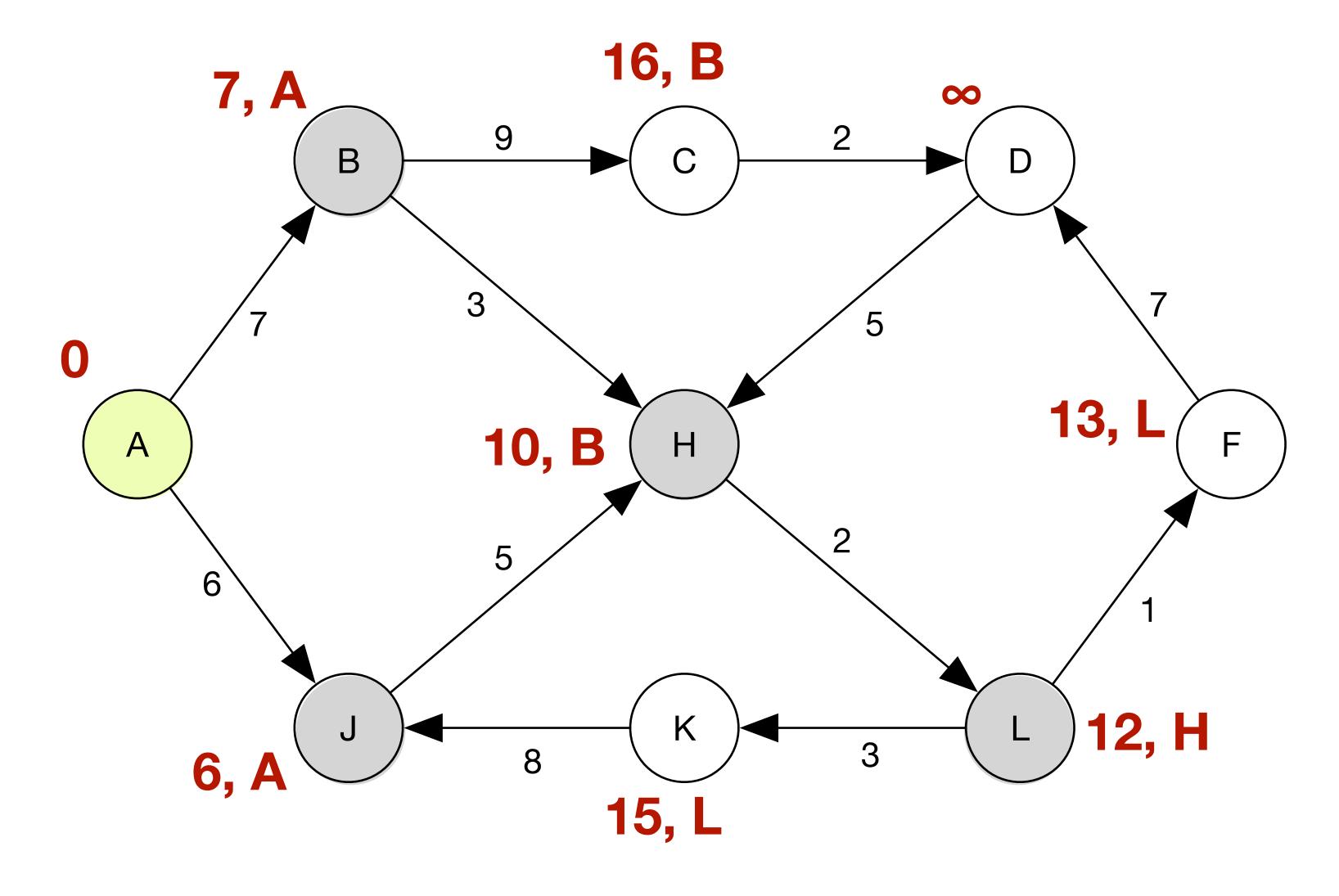
Choose next node from which to explore



Unvisited set

$$U = \{C, D, F, K\}$$

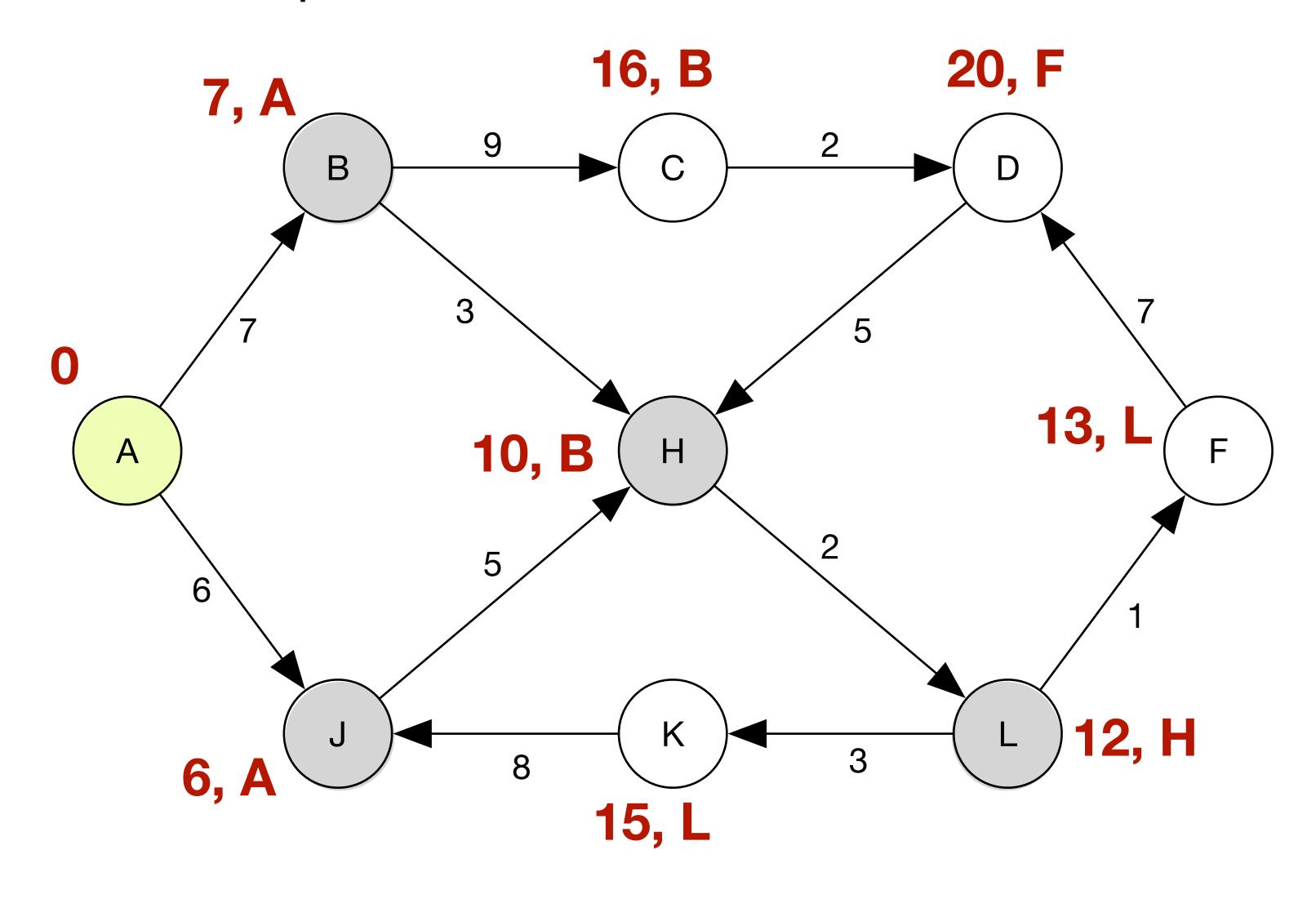
Explore from F and calculate distances



Unvisited set

$$U = \{C, D, F, K\}$$

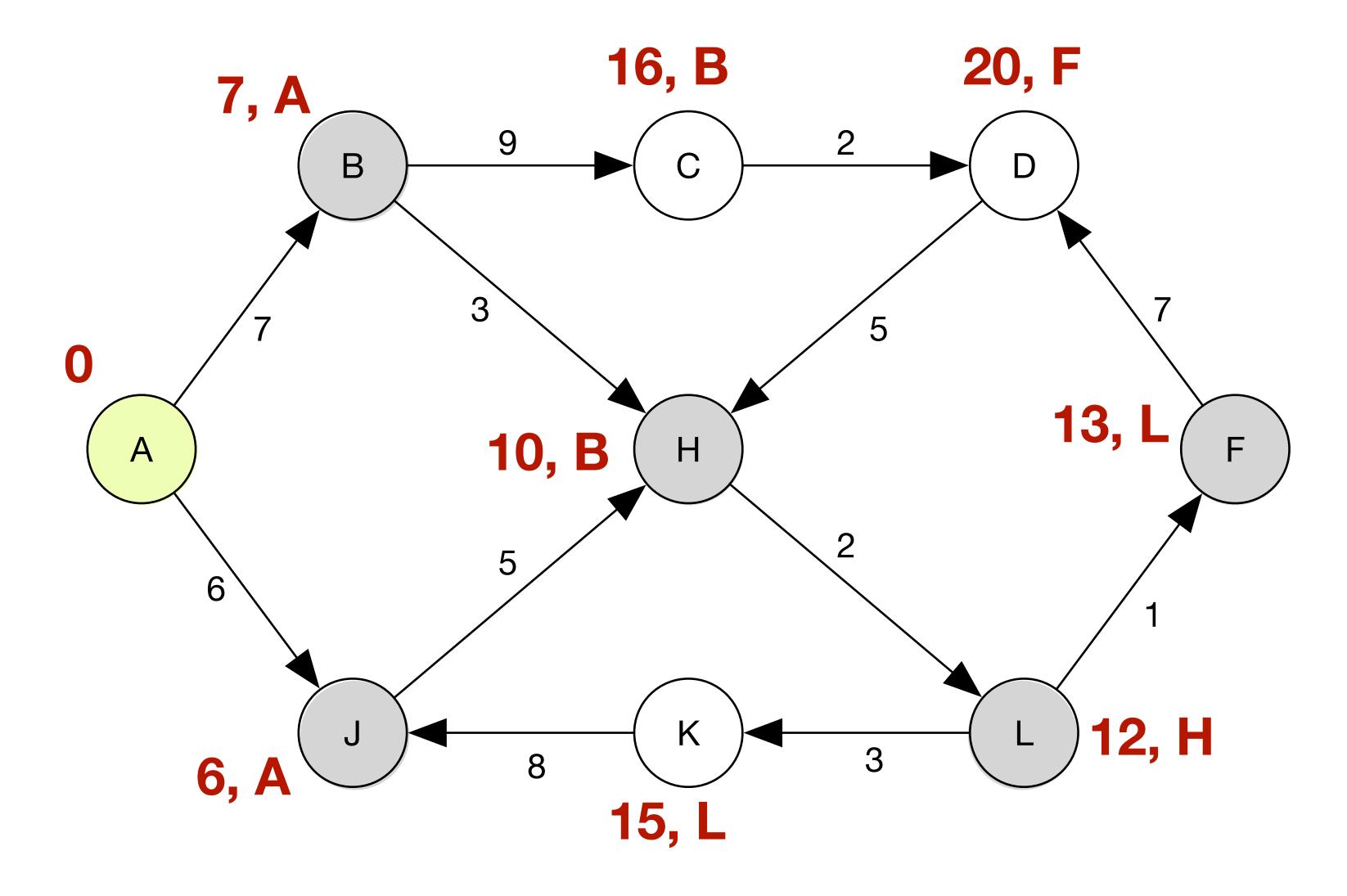
Explore from F and calculate distances



Unvisited set

$$U = \{C, D, K\}$$

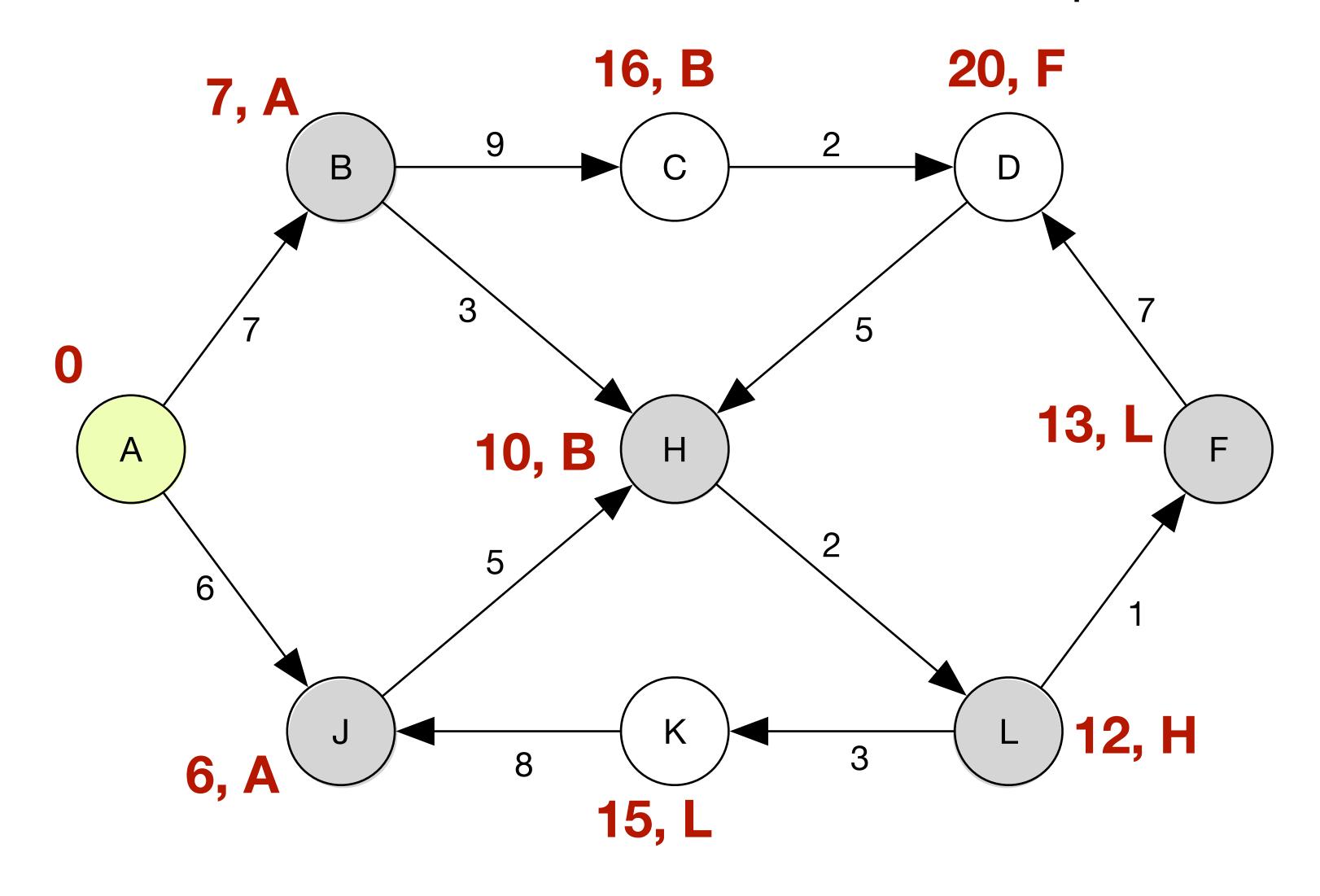
Mark F as visited



Unvisited set

$$U = \{C, D, K\}$$

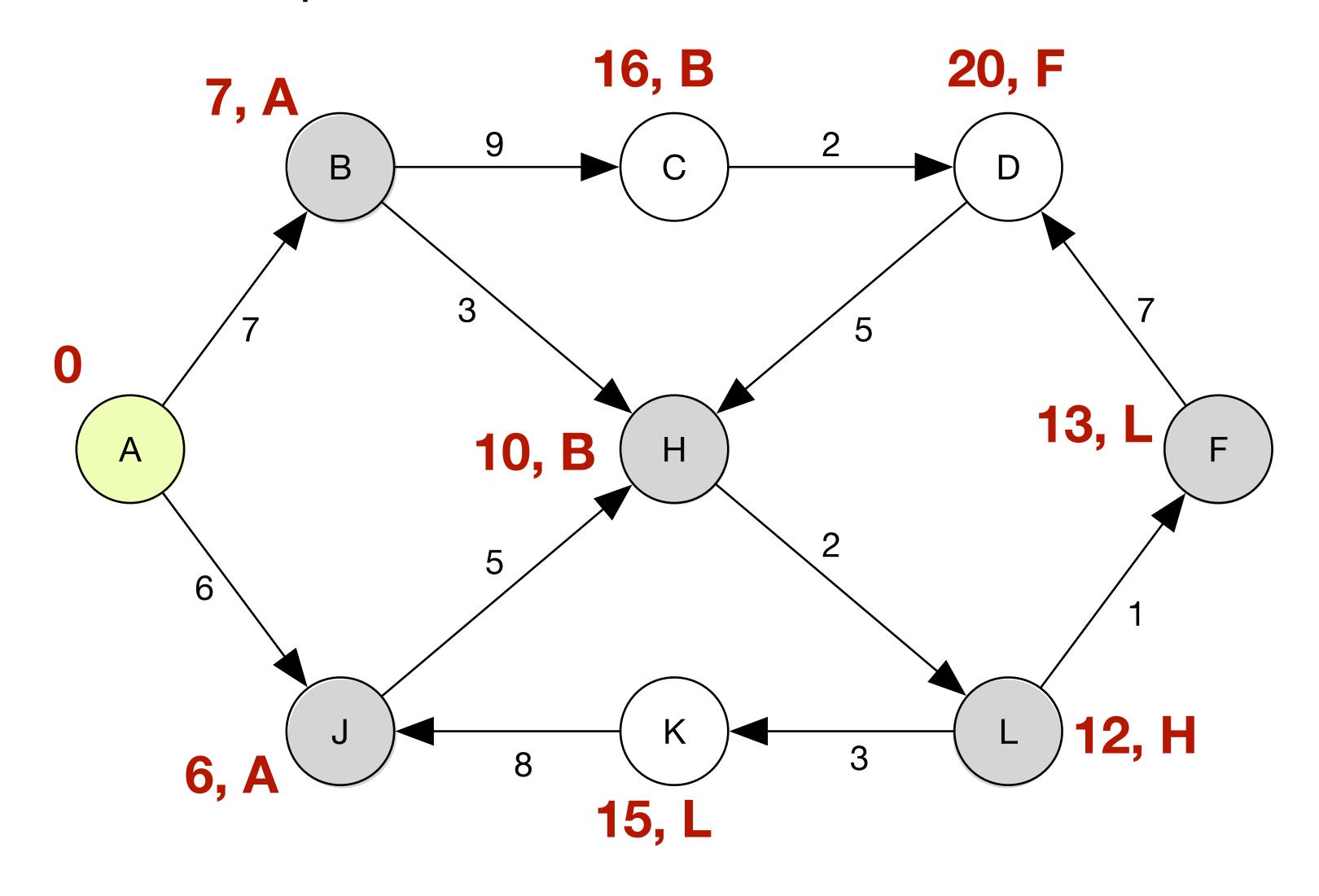
Choose next node from which to explore



Unvisited set

$$U = \{C, D, K\}$$

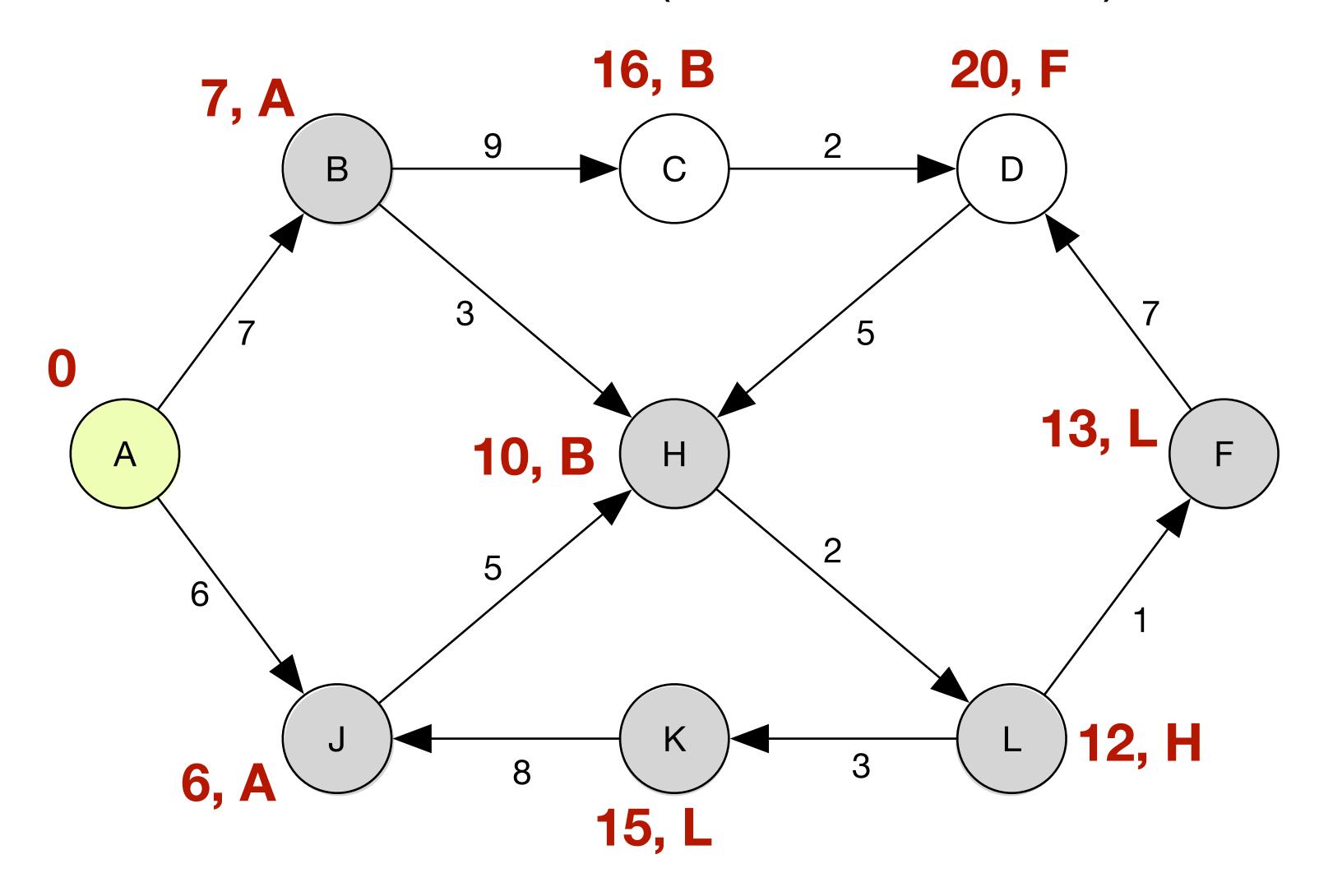
Explore from K and calculate distances



Unvisited set

$$U = \{C, D\}$$

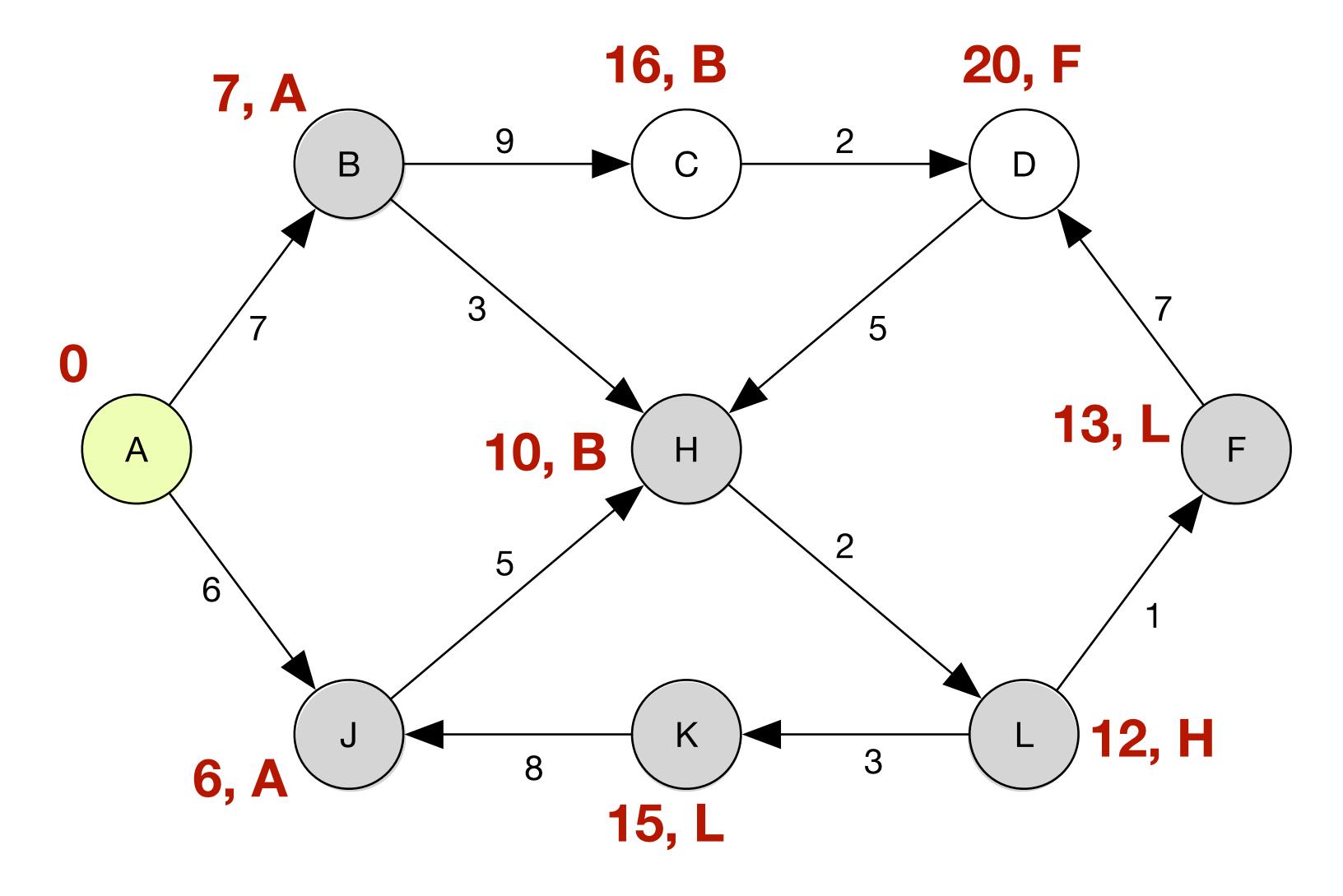
Mark K as visited (remove from set U)



Unvisited set

$$U = \{C, D\}$$

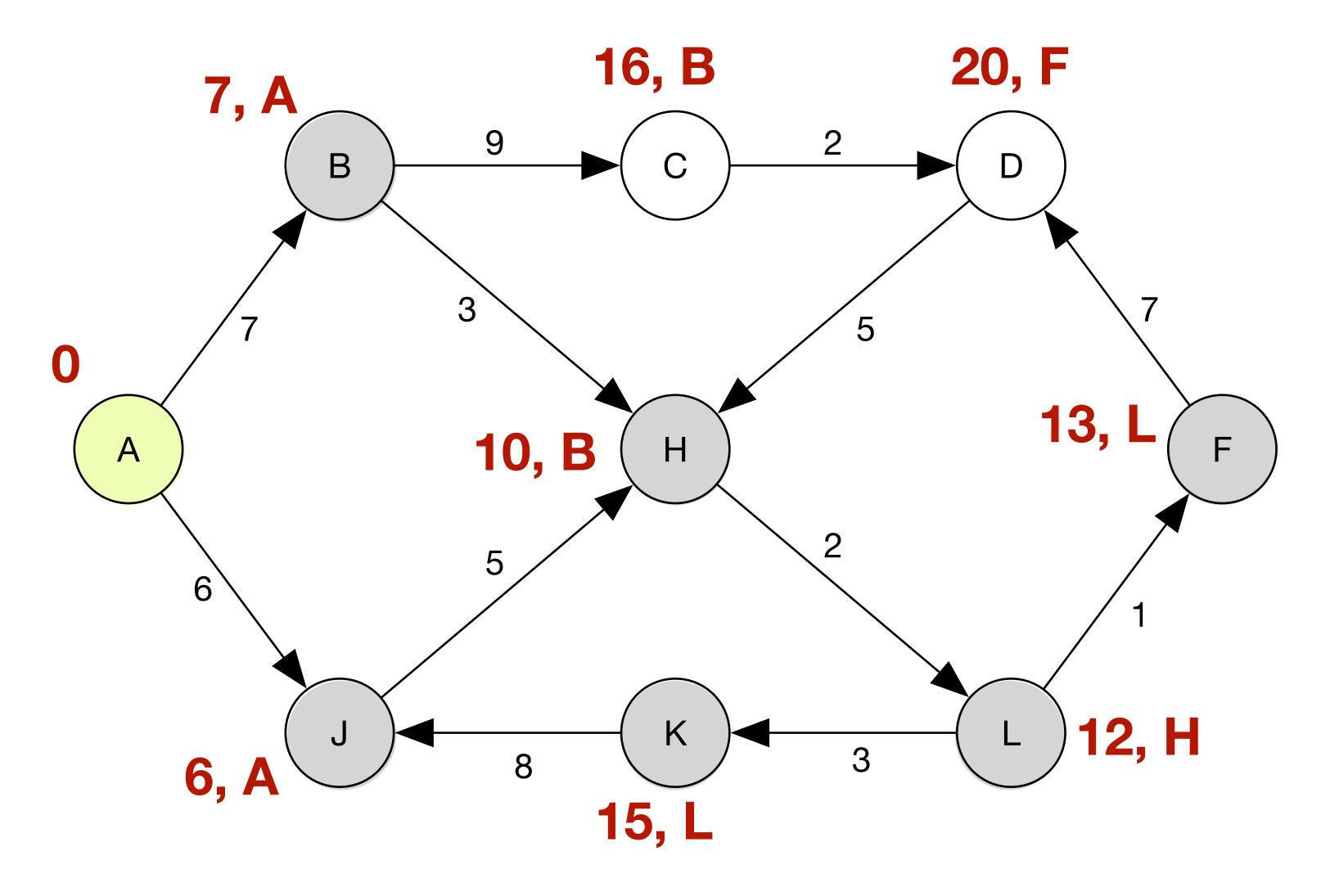
Choose next node from which to explore



Unvisited set

$$U = \{C, D\}$$

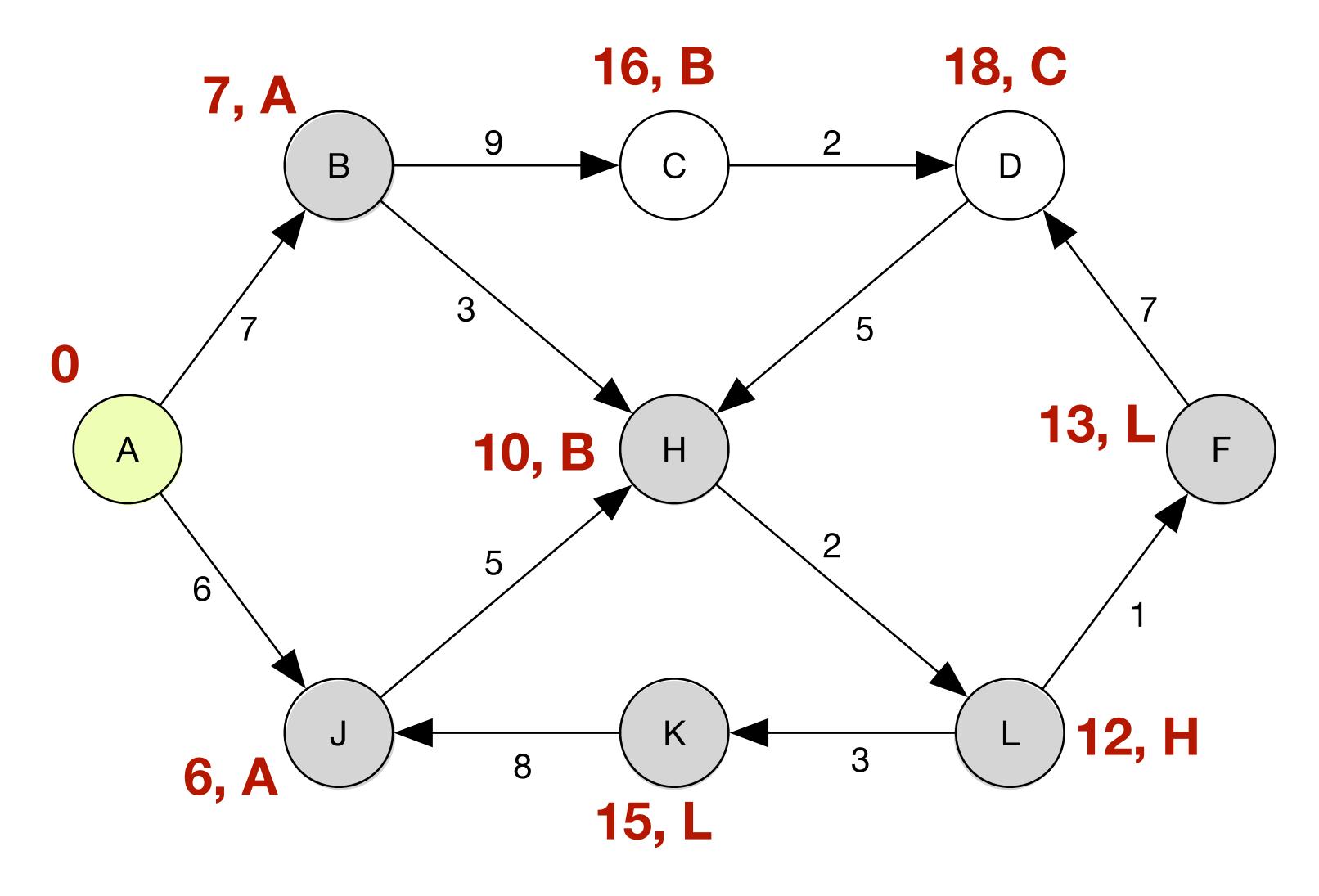
Explore from C and calculate distances



Unvisited set

$$U = \{C, D\}$$

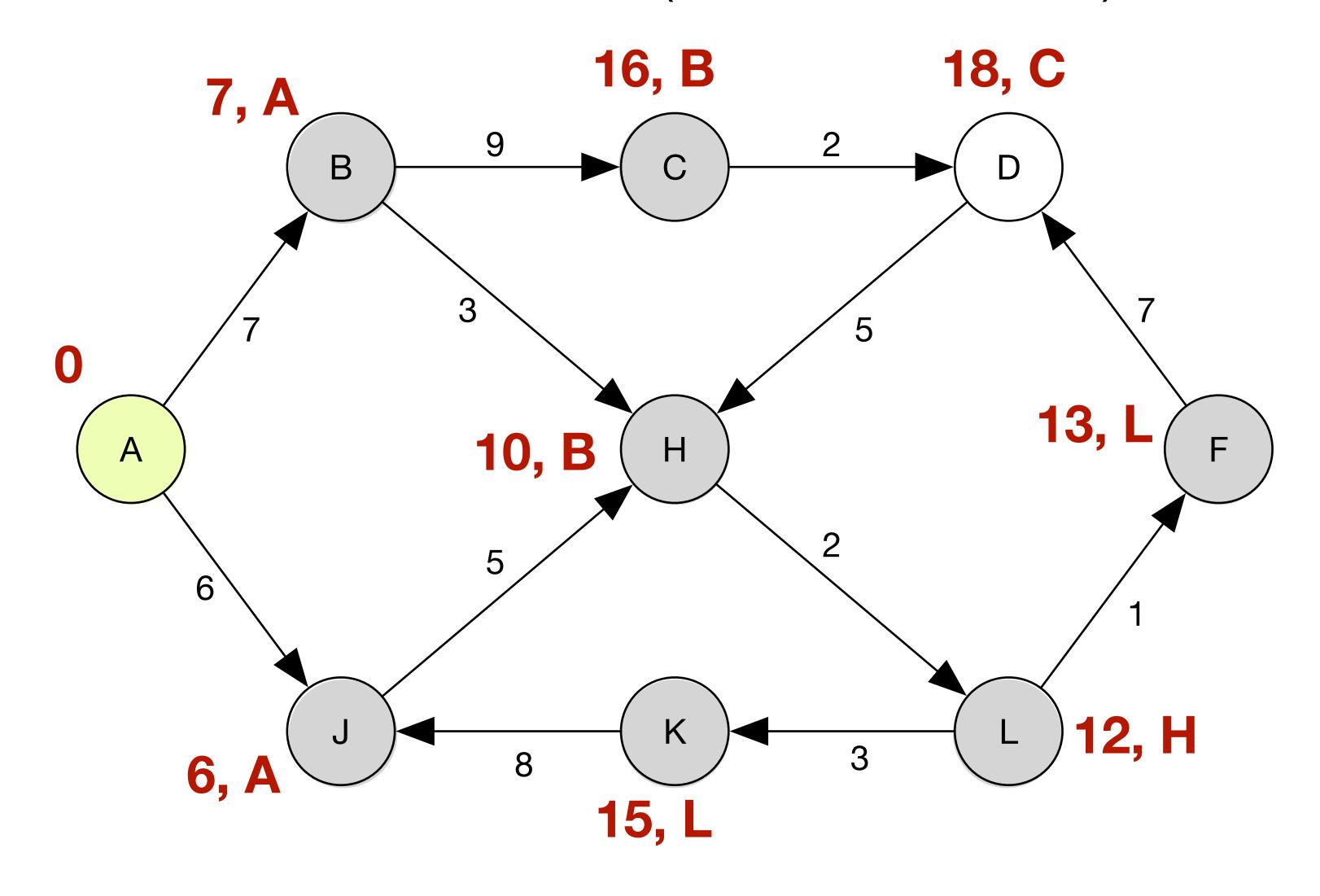
Explore from C and calculate distances



Unvisited set

$$U = \{D\}$$

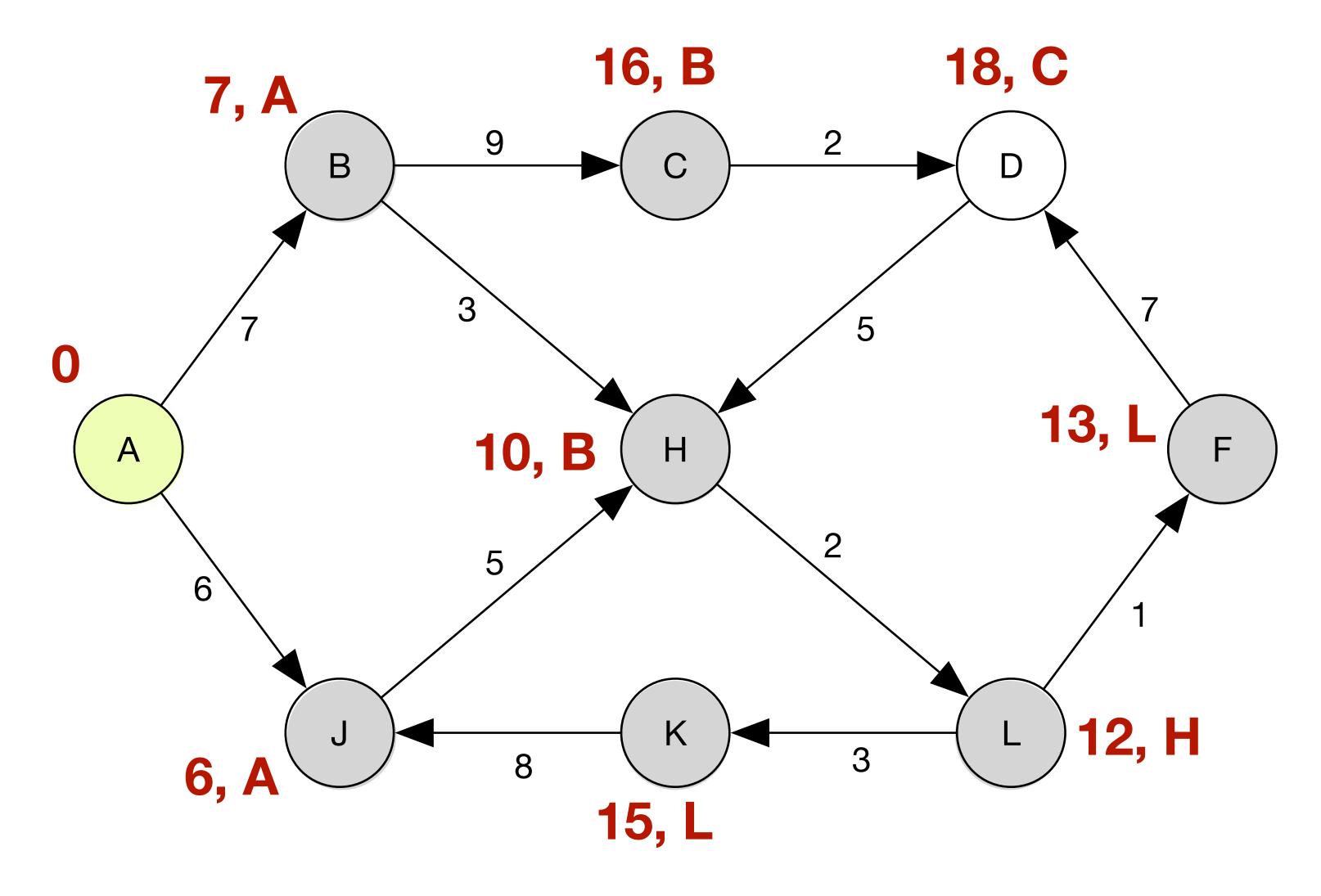
Mark C as visited (remove from set U)



Unvisited set

$$U = \{D\}$$

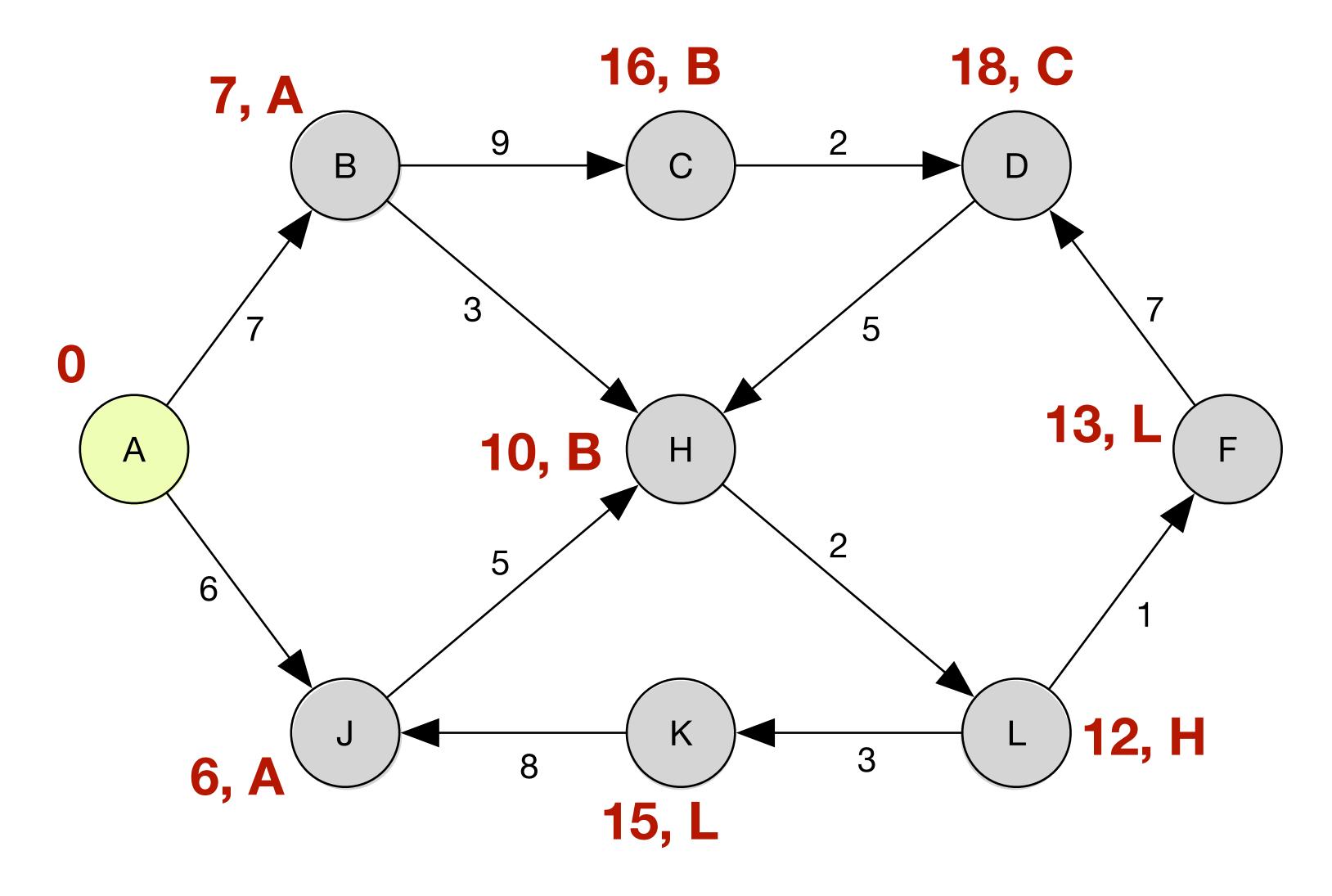
Explore from D and calculate distances.



Unvisited set

$$\mathsf{U} = \{\}$$

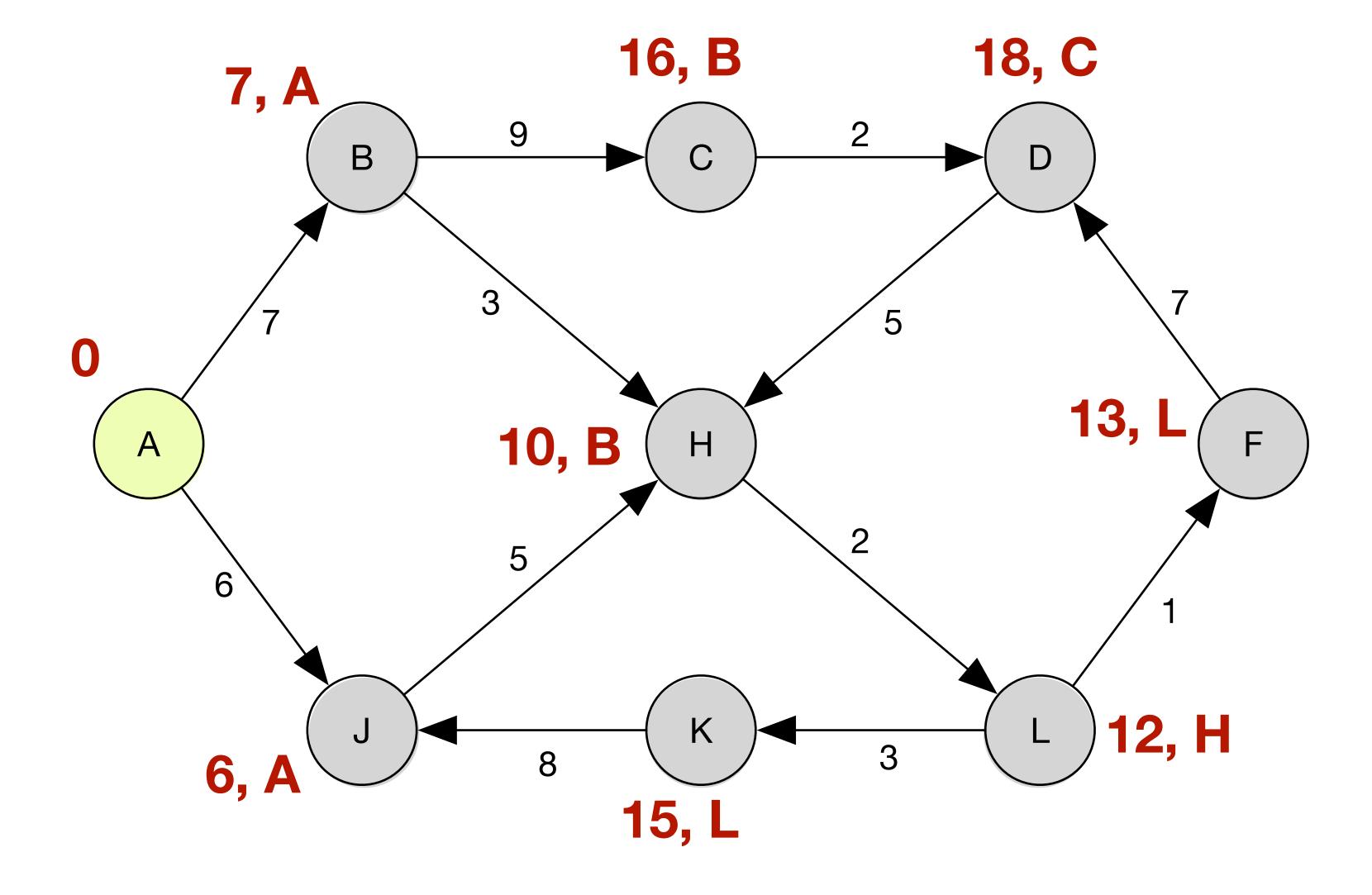
Mark D as visited (remove from set U)



Unvisited set

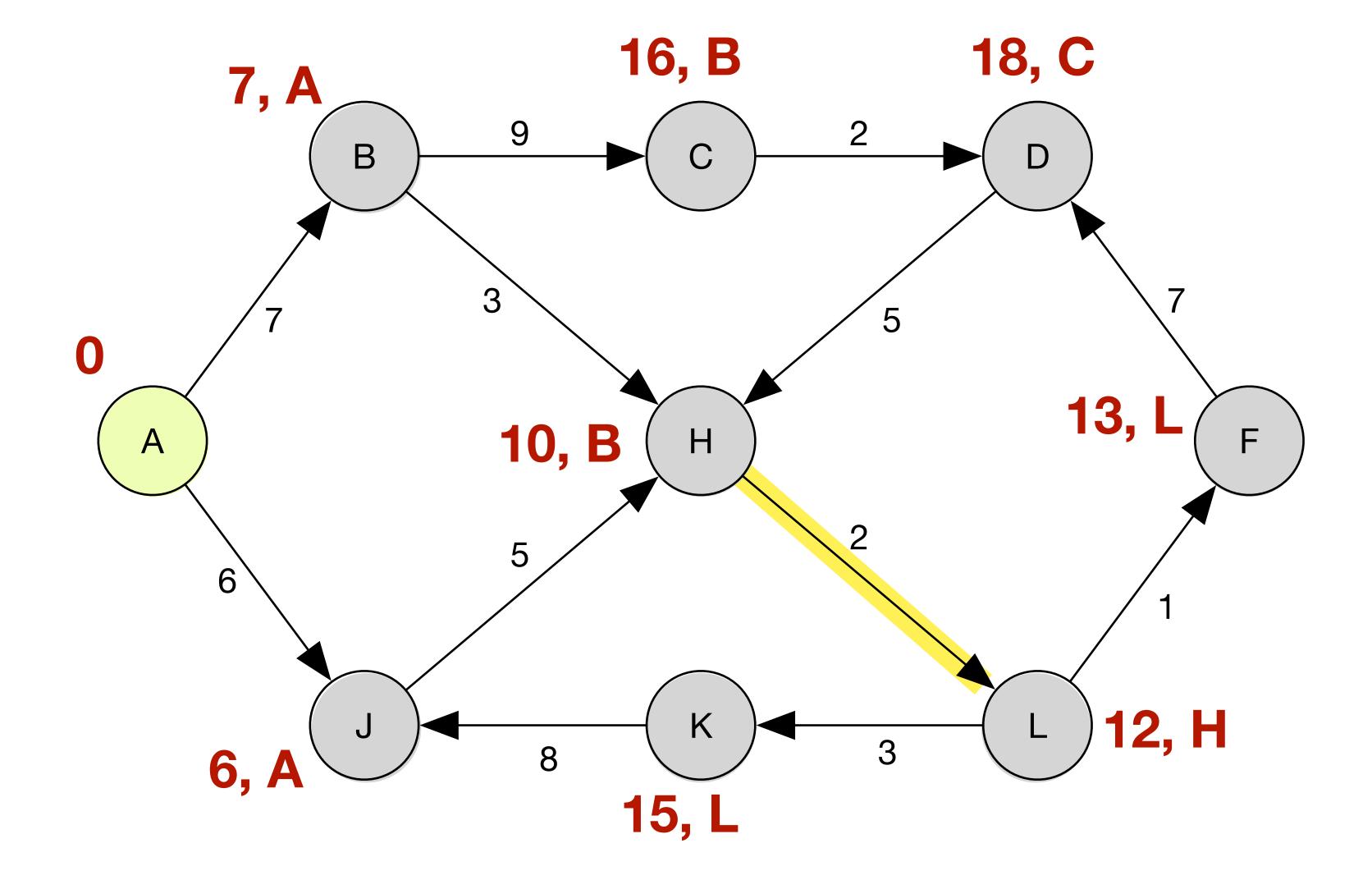
$$\mathsf{U} = \{\}$$

Done!



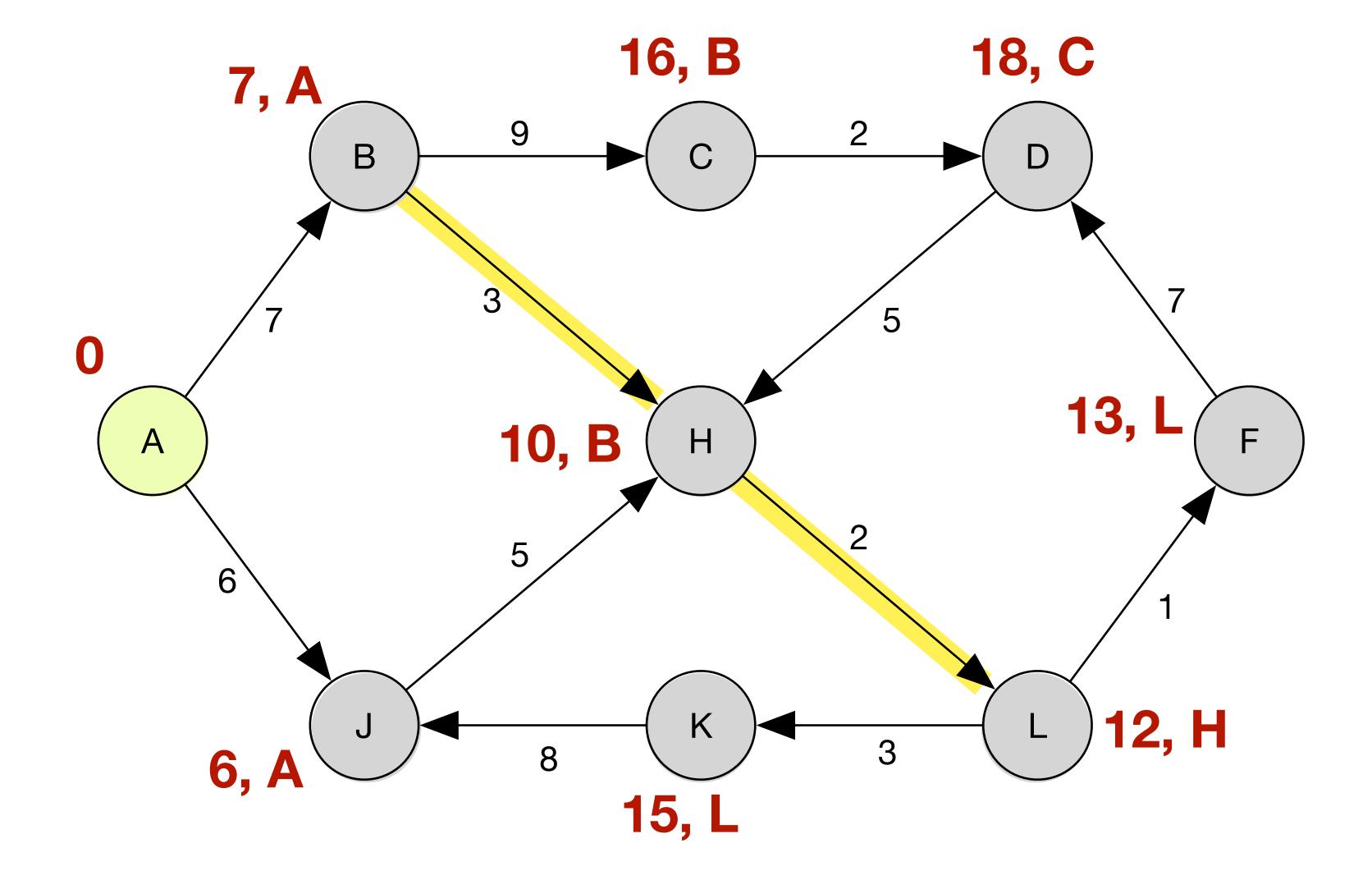
Unvisited set

$$\mathsf{U} = \{\}$$



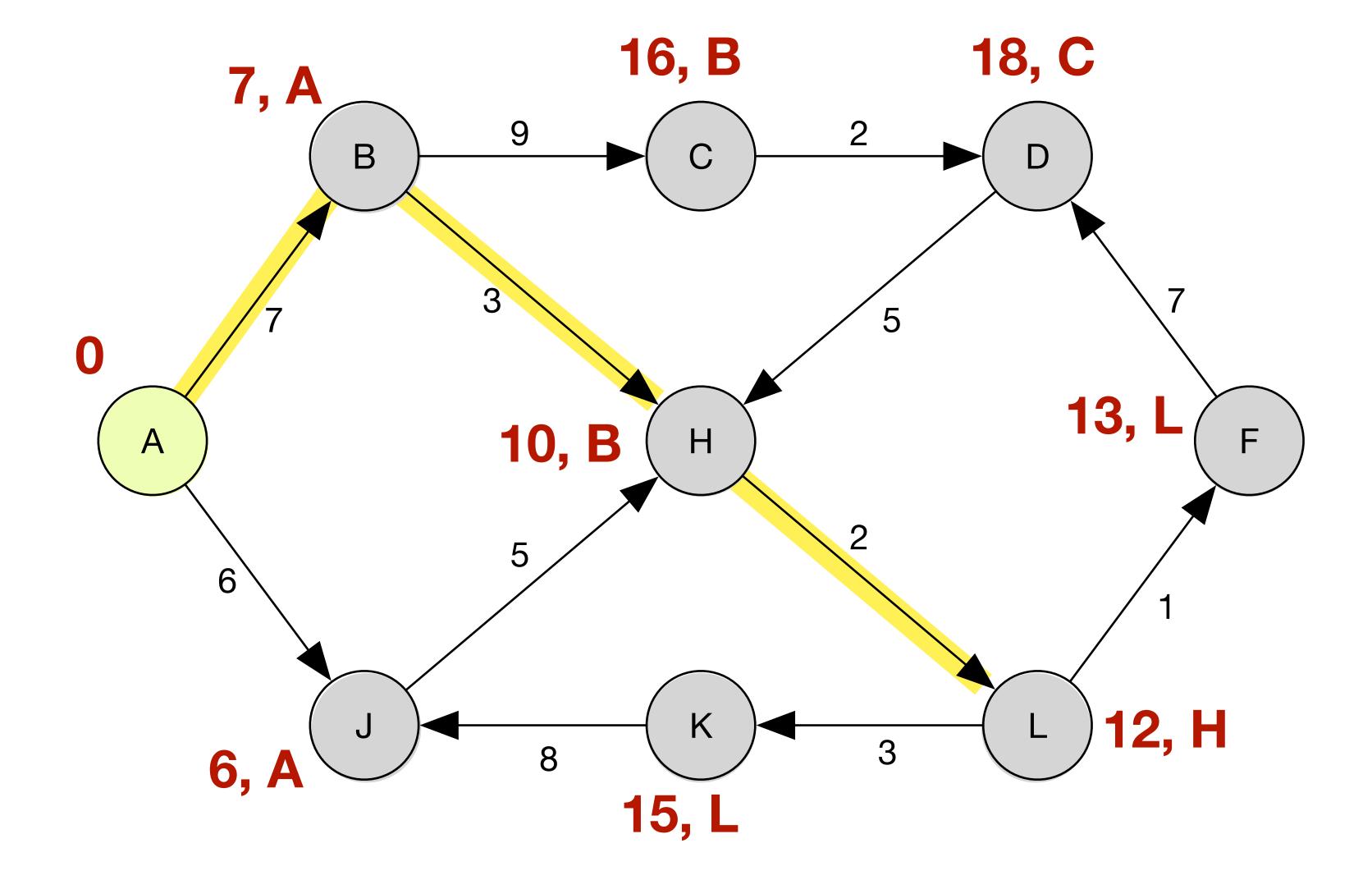
Unvisited set

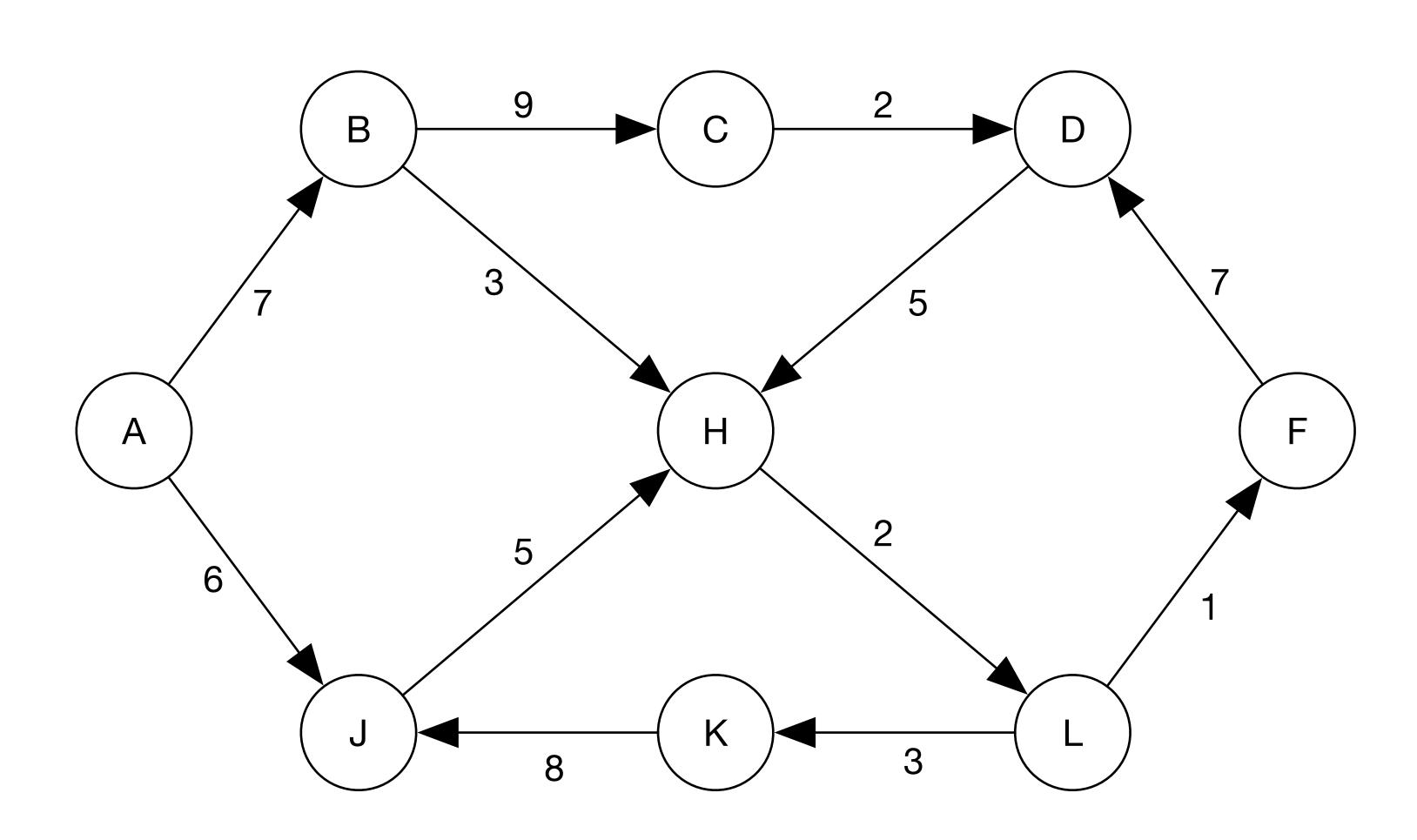
$$\mathsf{U} = \{\}$$



Unvisited set

$$\mathsf{U} = \{\}$$





What did you notice about how we chose the nodes to visit?

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We always chose the node with the smallest distance.

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Can you think of a data structure that's handy for always extracting the smallest value?

What did you notice about how we chose the nodes to visit?

We always chose the node with the smallest distance.

Can you think of a data structure that's handy for always extracting the smallest value?

A minimum priority queue!

Dijkstra's algorithm: pseudocode

```
function dijkstra(G, S) // G is the graph; S is the starting node
 for each node V in G
     arrived_from[V] = null
     if V = S
         distance[V] = 0
     else
         distance[V] = infinite
     add V to priority queue Q
while Q is not empty
     V = get min from Q
     for each unvisited neighbor N of V
         distance = distance[V] + distance to N
         if distance < distance[N] // We've found a shorter distance
             distance[N] = distance
             arrived_from[N] = V
```

Dijkstra's algorithm works for any directed graph so long as all weights are non-negative

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Worst case complexity (using min priority queue)

$$\mathcal{O}((|V| + |E|) \log |V|)$$

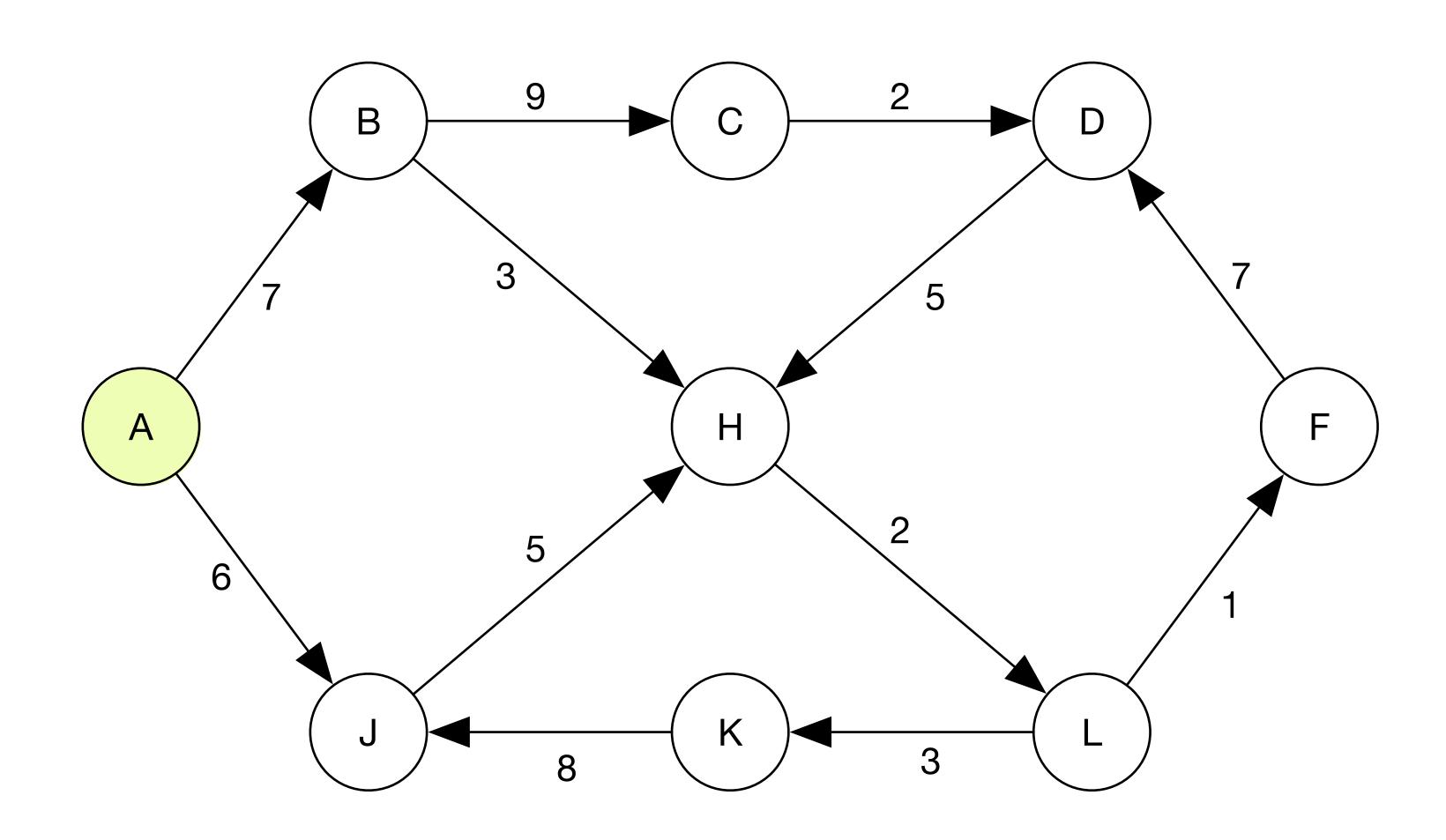
Dijkstra's algorithm works for any directed graph so long as all weights are non-negative

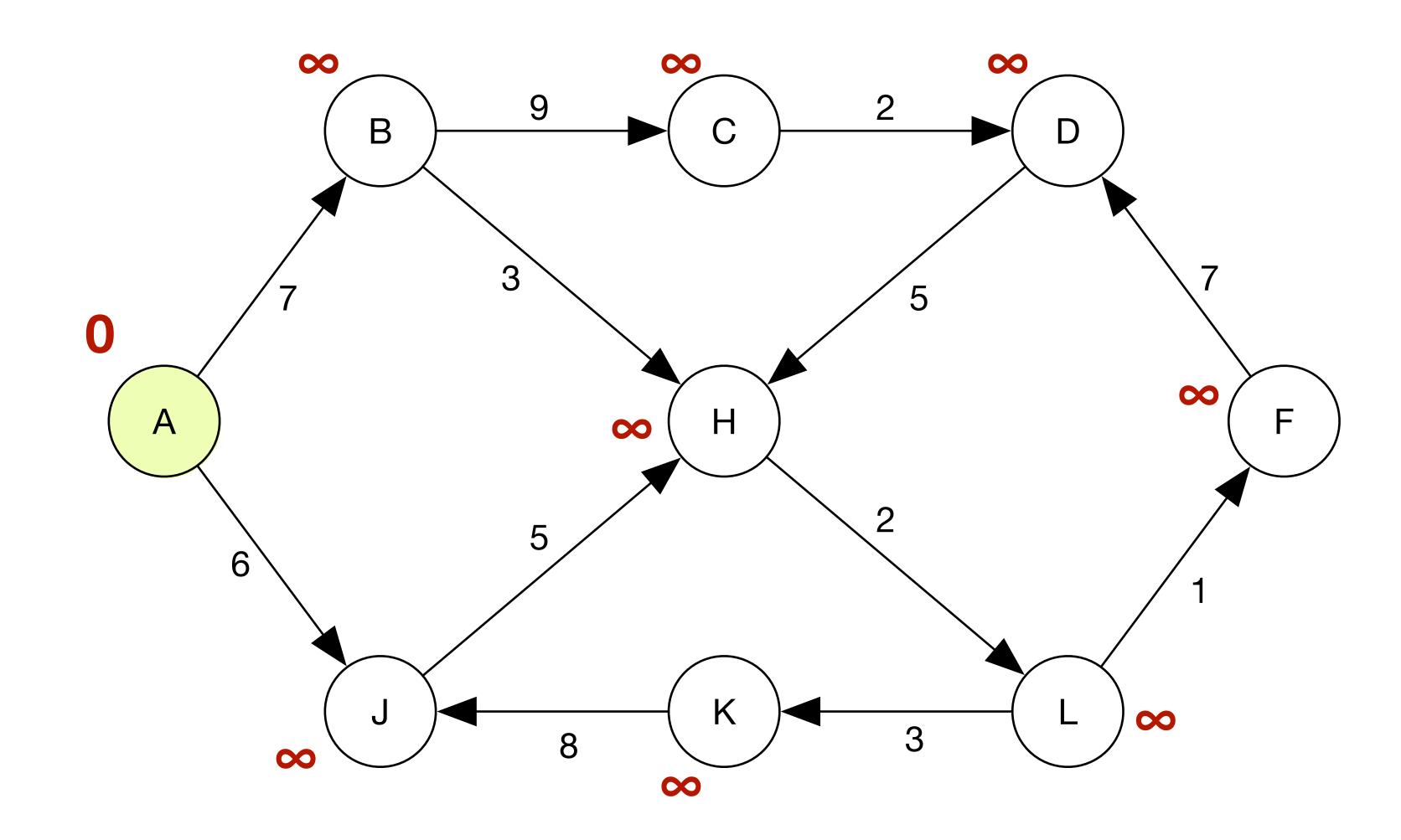
Worst case complexity (using min priority queue)

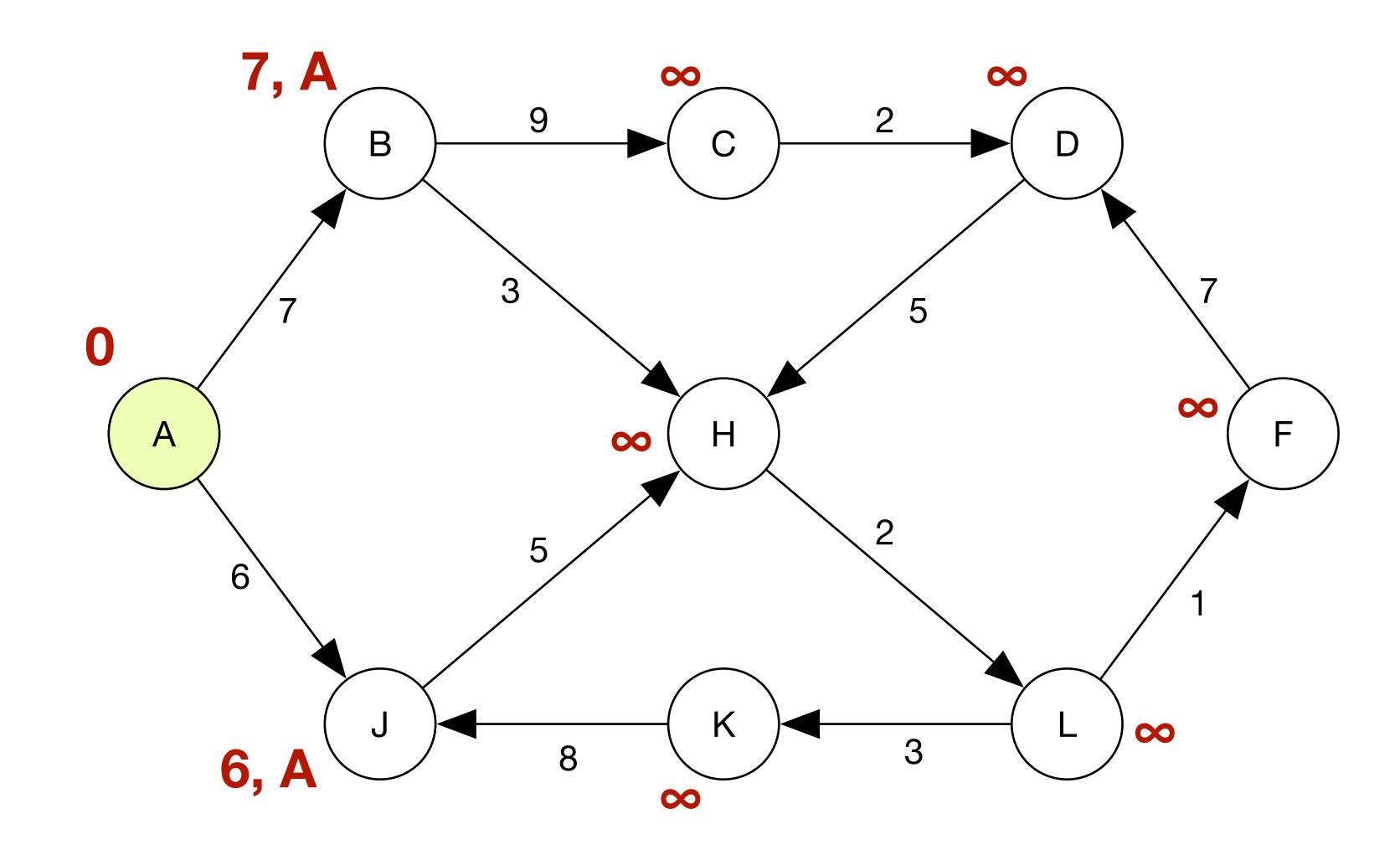
$$\mathcal{O}((|V| + |E|) \log |V|)$$

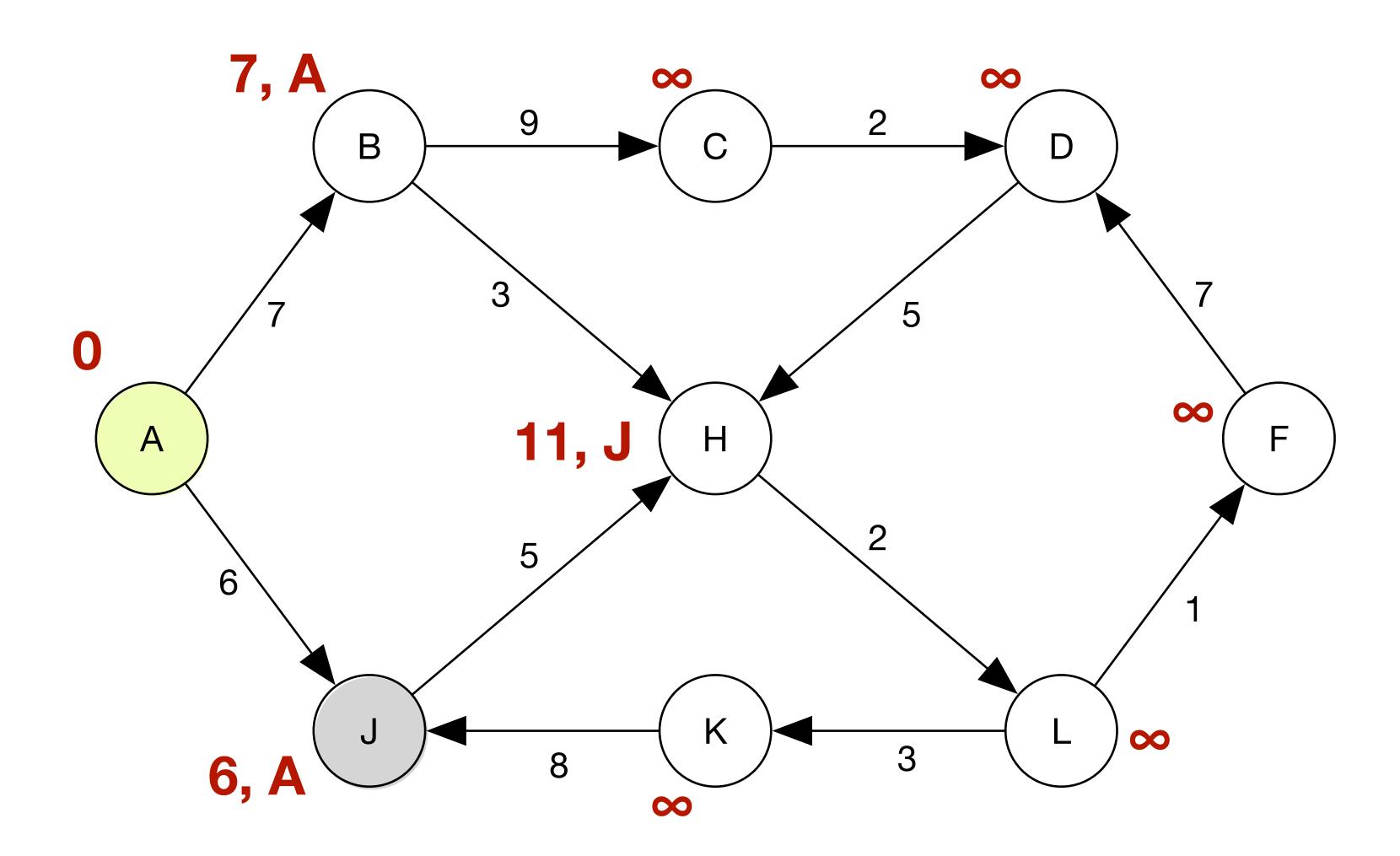
Greedy algorithm. Always chooses the best (shortest) distance found so far.

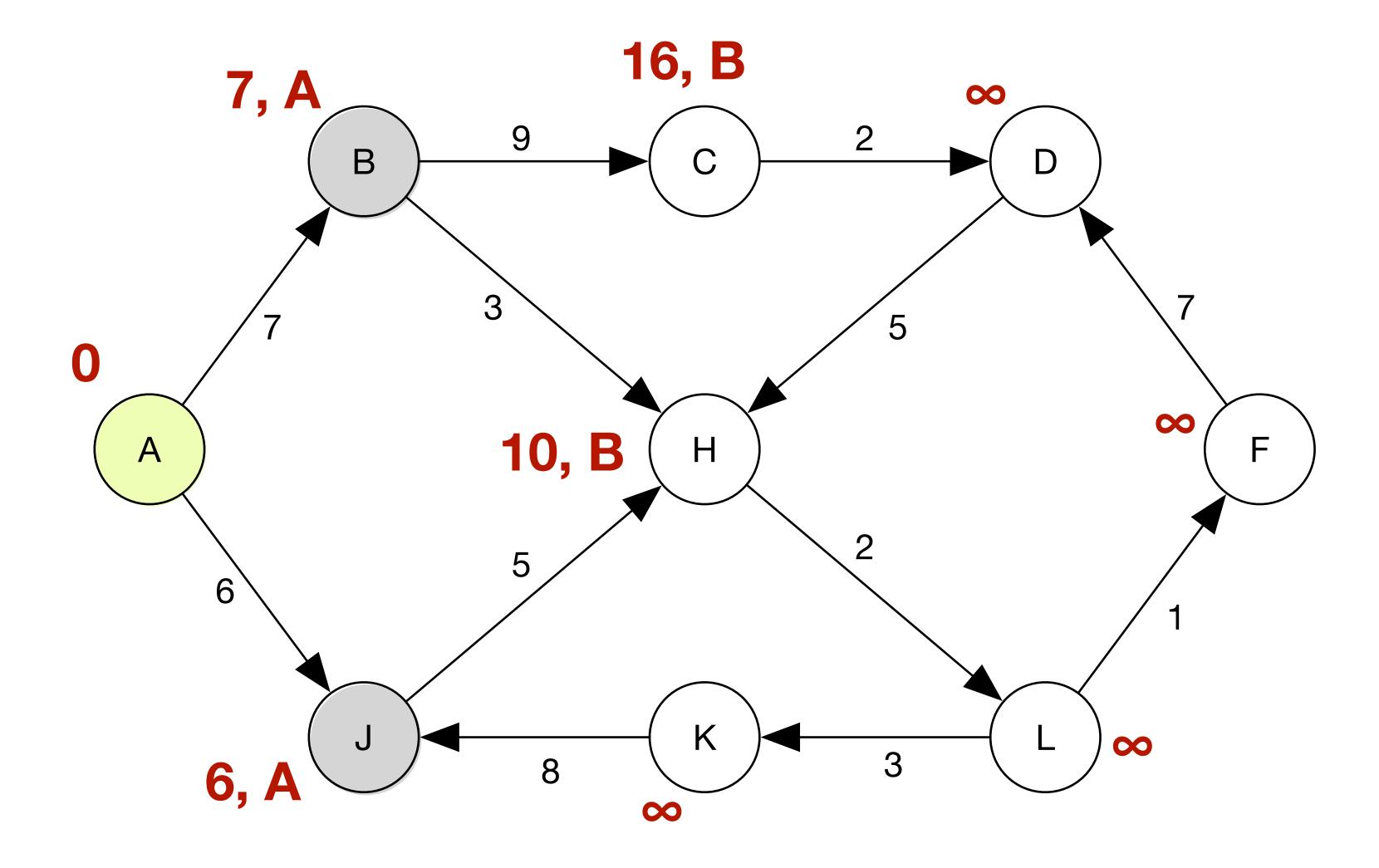
Greedy approach. We always use the best (shortest) distance we've calculated so far, and we never go back -- once a node is marked as visited we never revisit it.

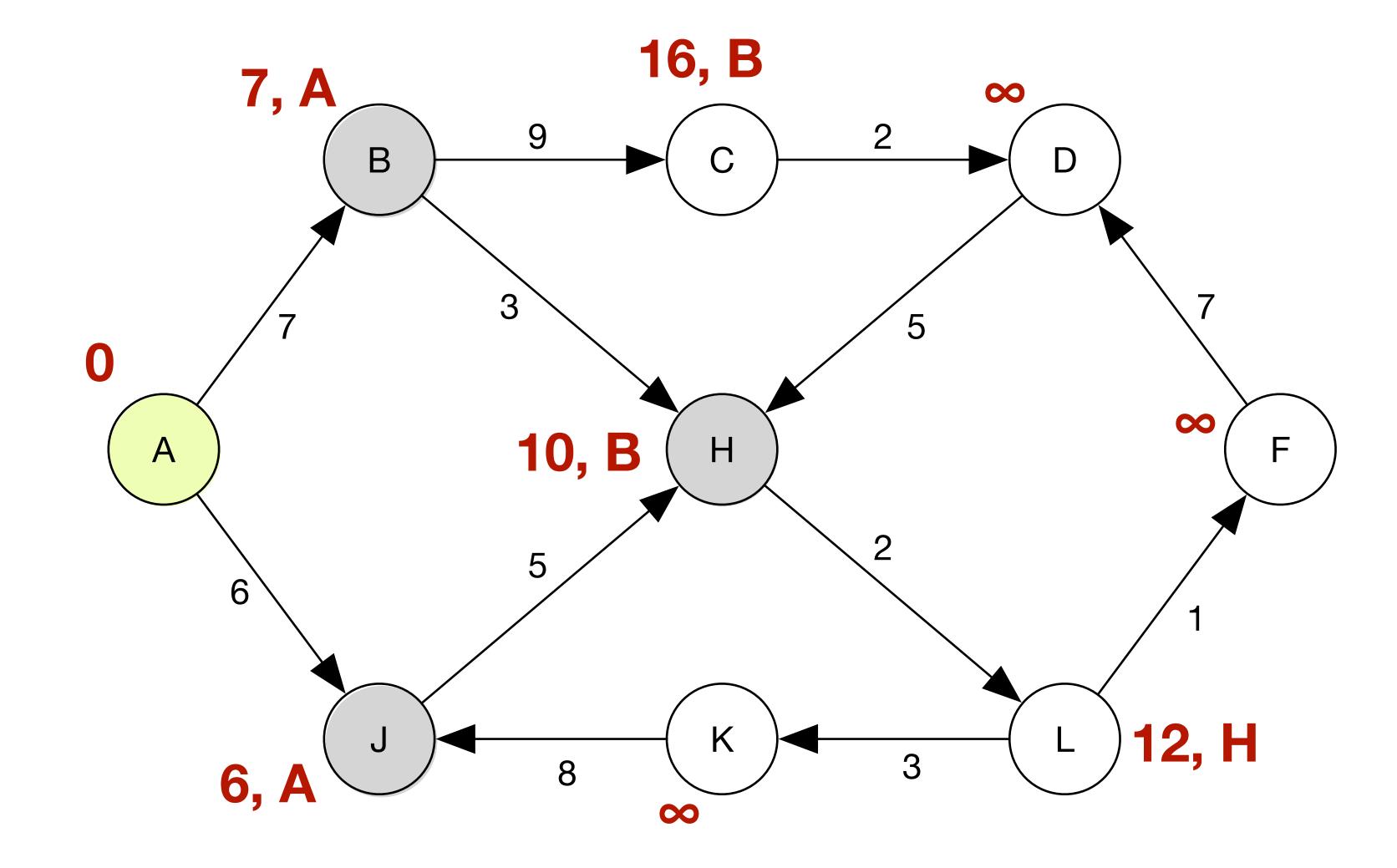




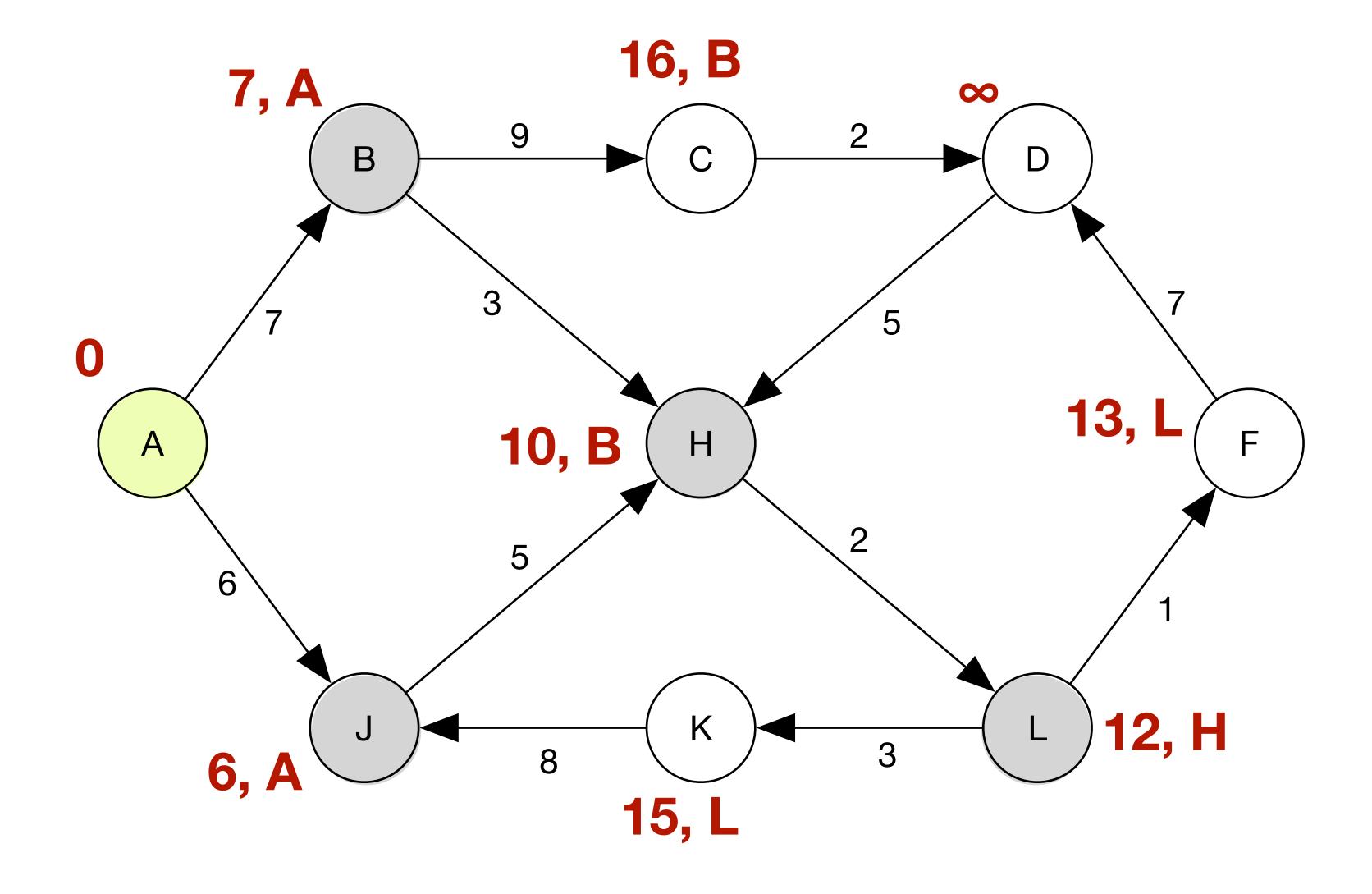






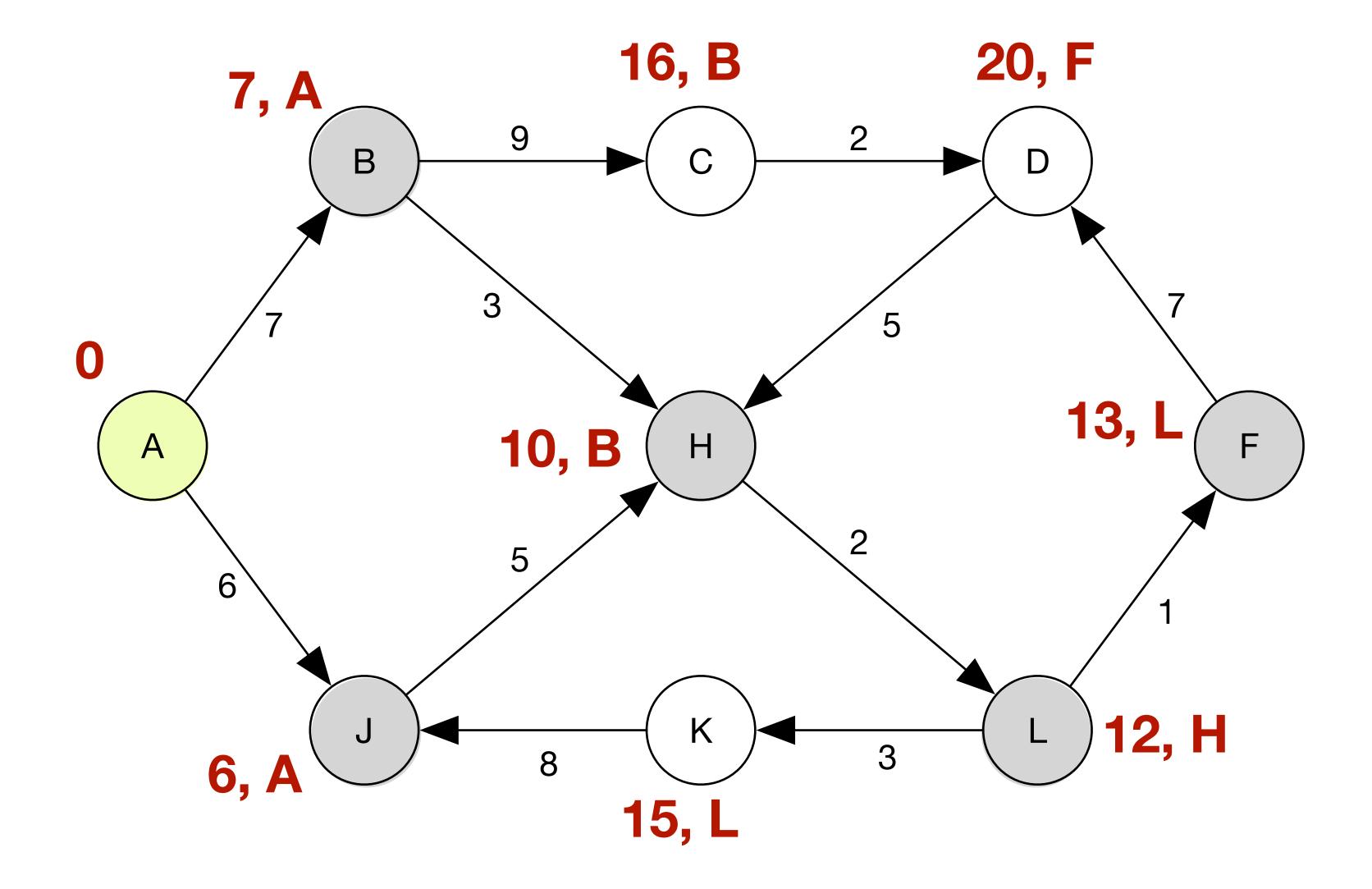


$$U = \{C, D, F, K\}$$

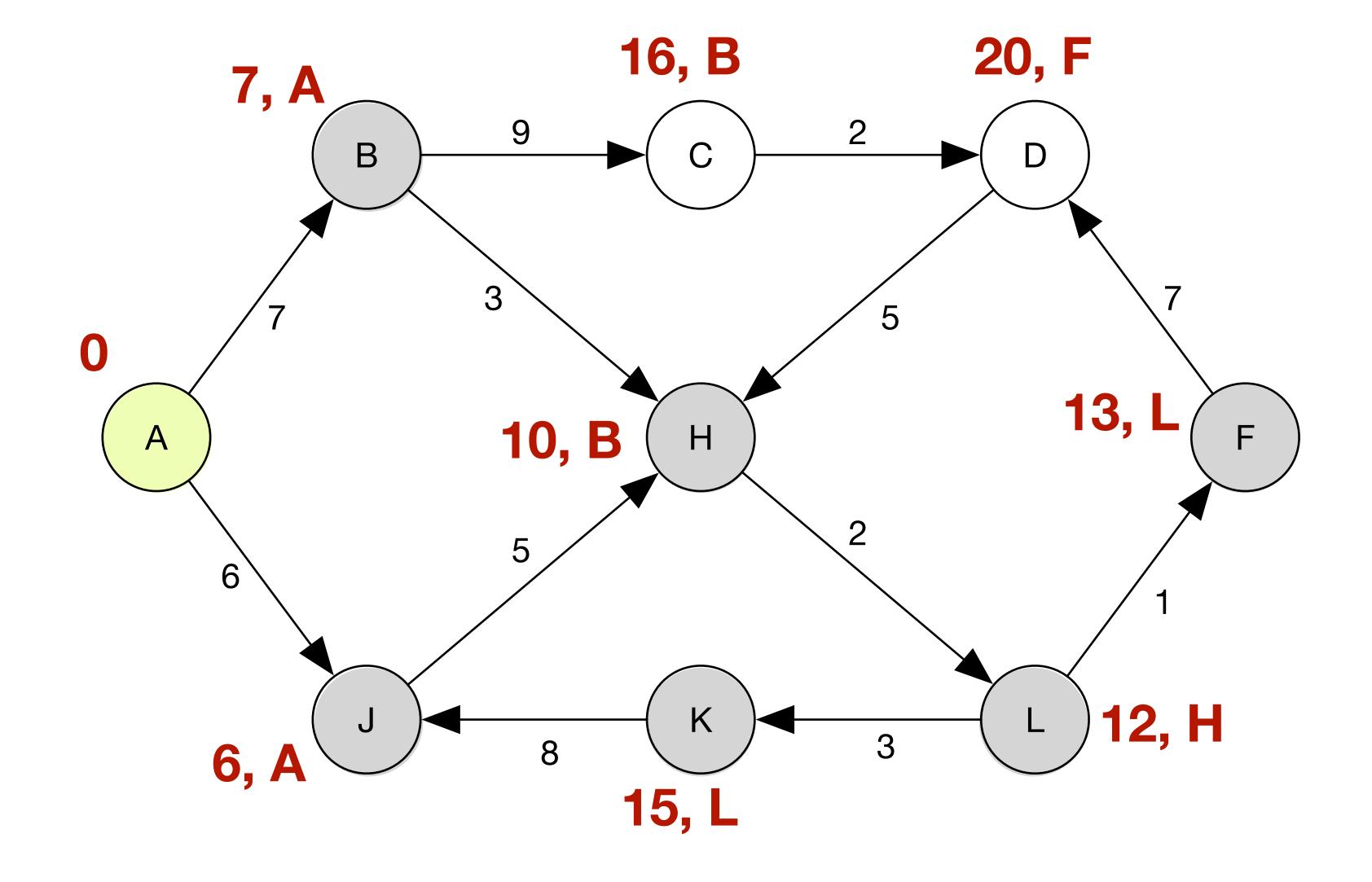


Unvisited set

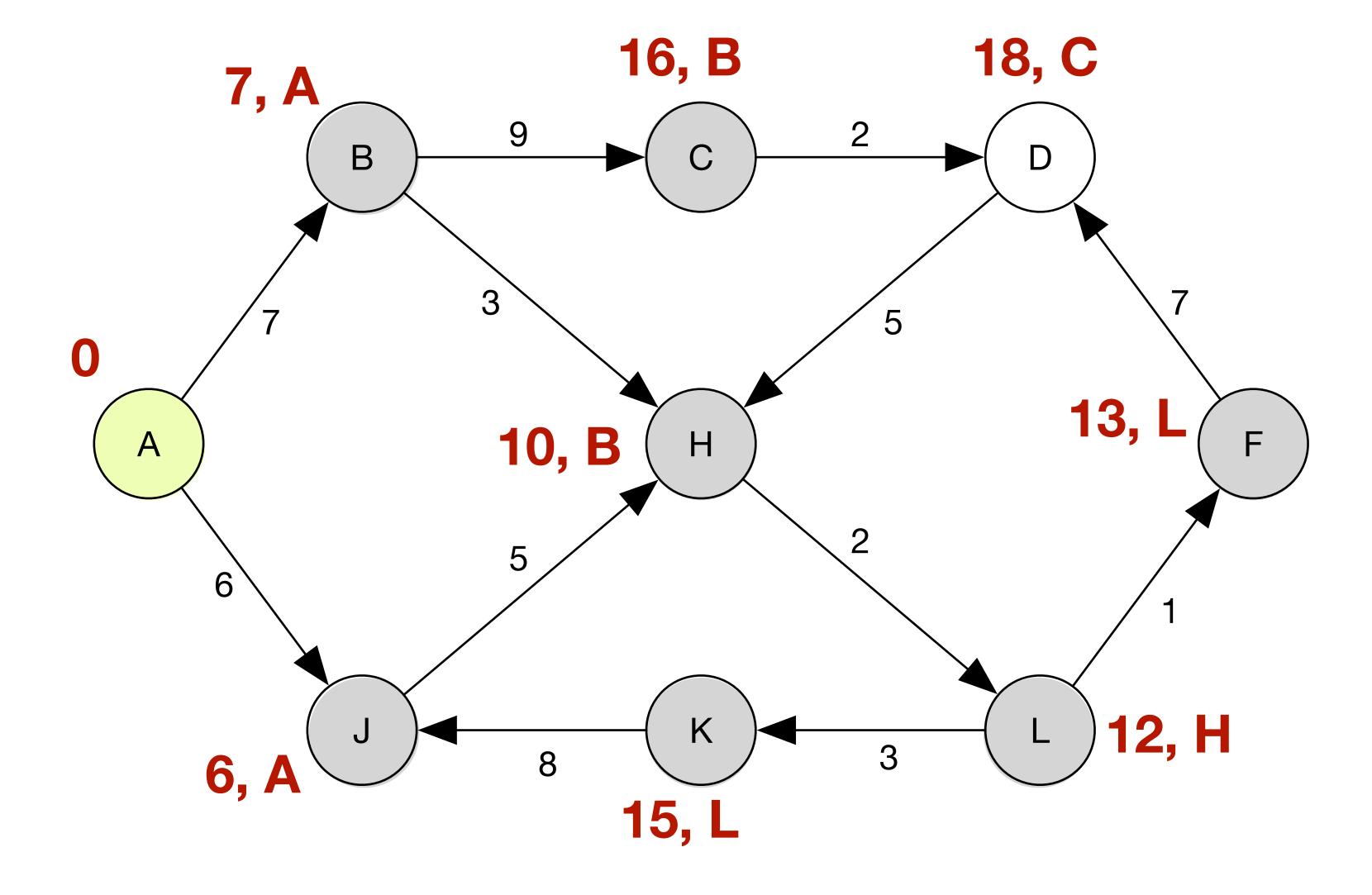
 $U = \{C, D, K\}$



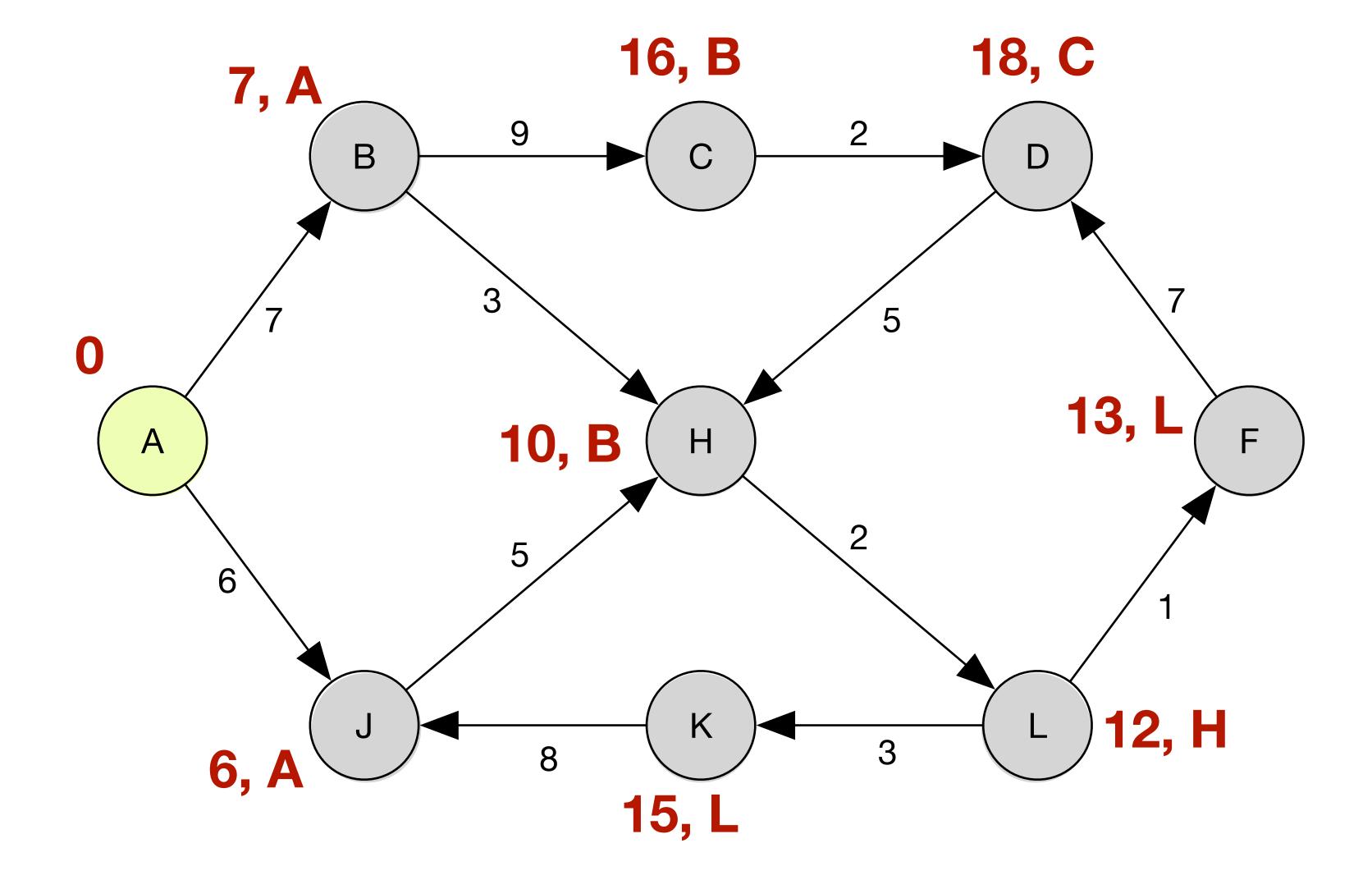
$$U = \{C, D\}$$



$$U = \{D\}$$

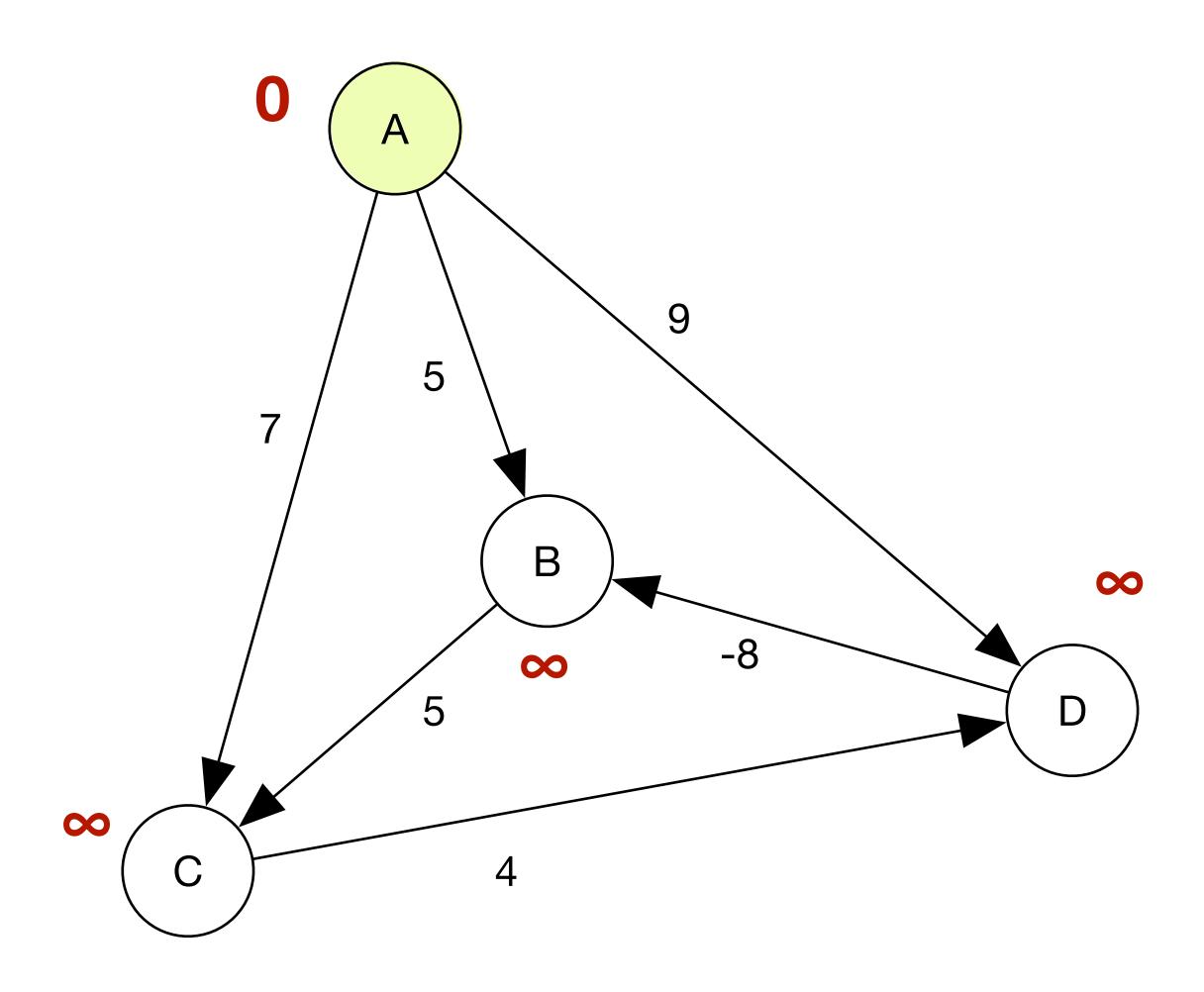


$$\mathsf{U} = \{\}$$

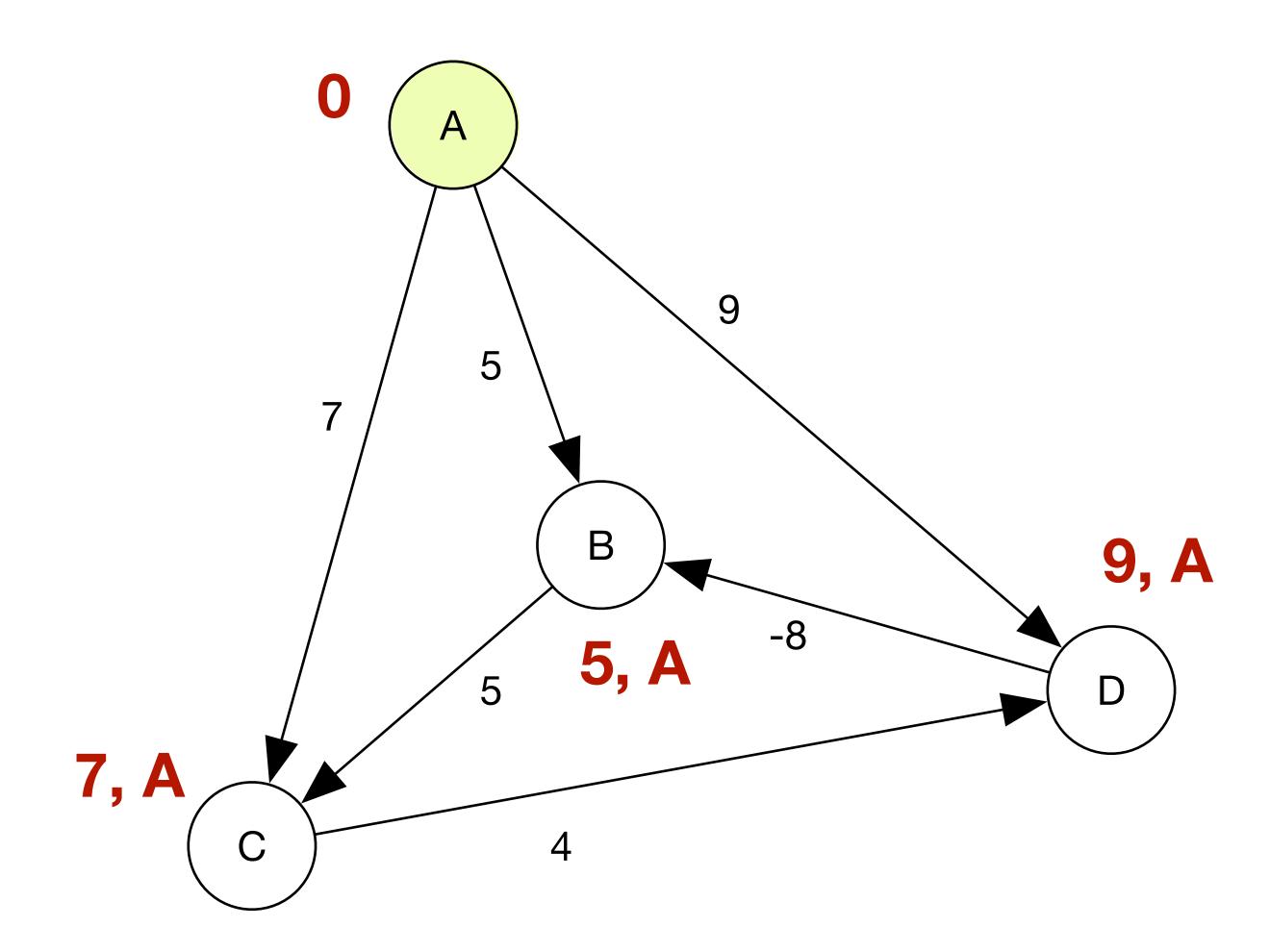


Why doesn't Dijkstra's algorithm work with negative weights?

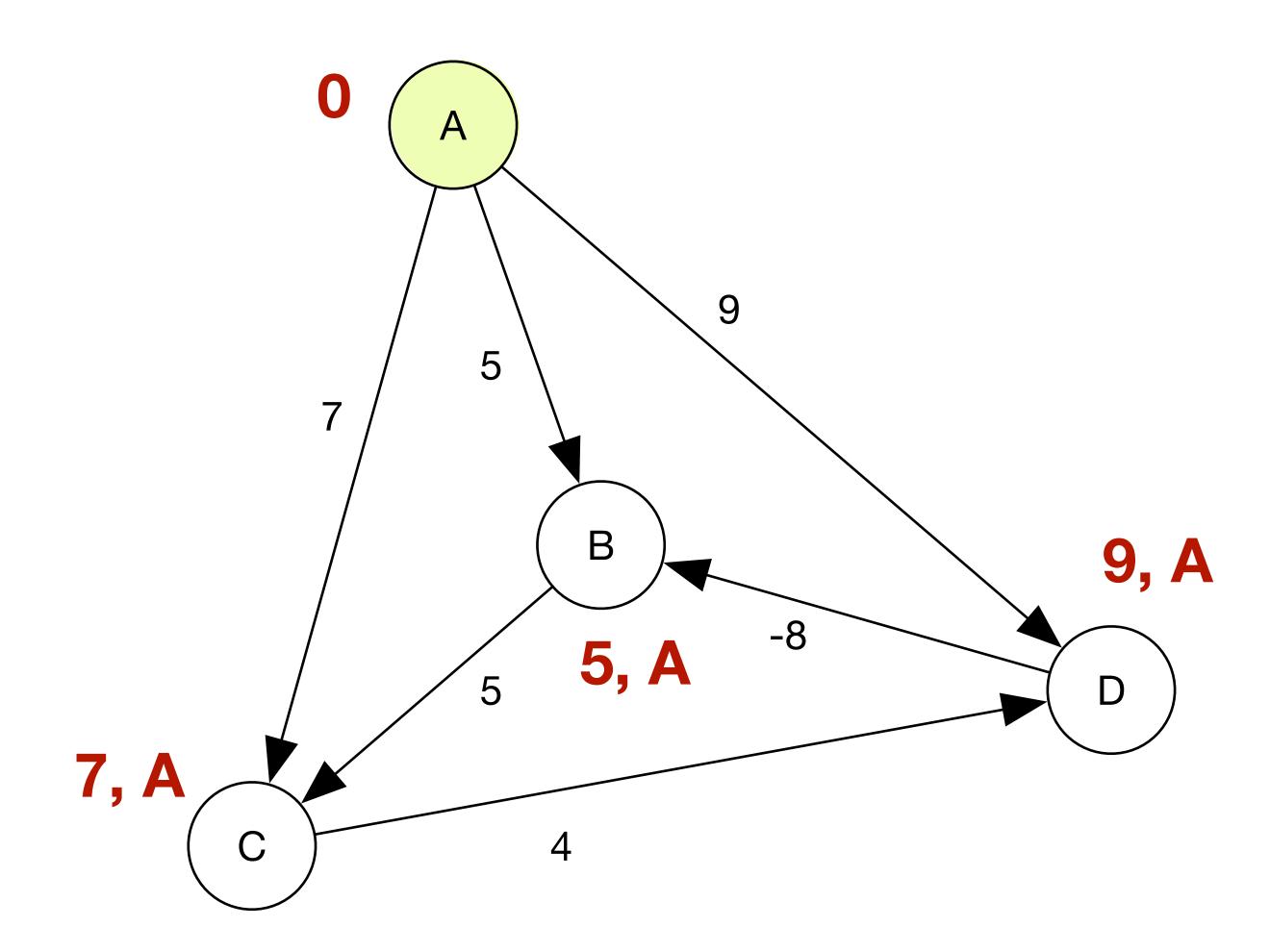
 $U = \{A, B, C, D\}$



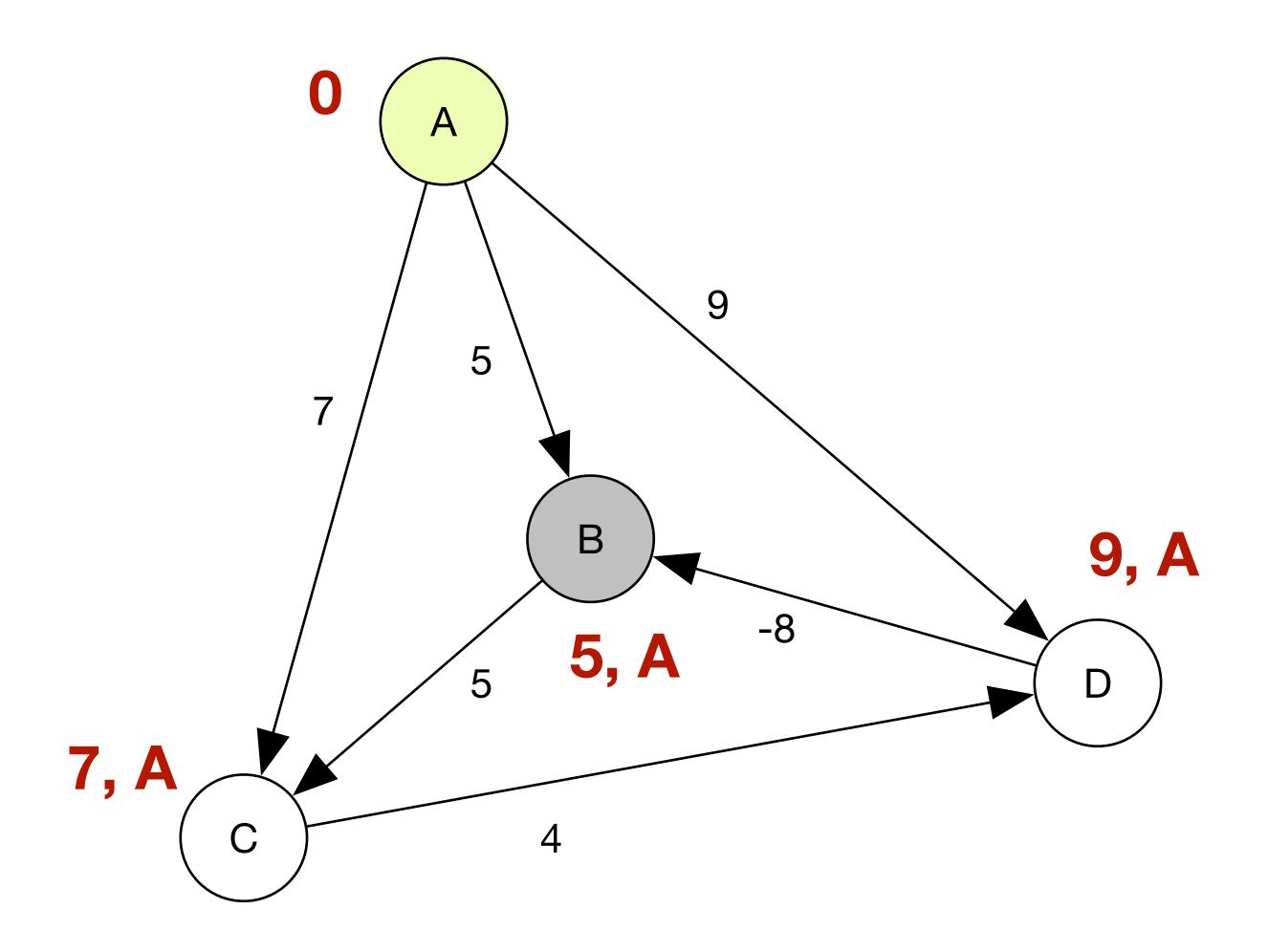
$$U = \{B, C, D\}$$



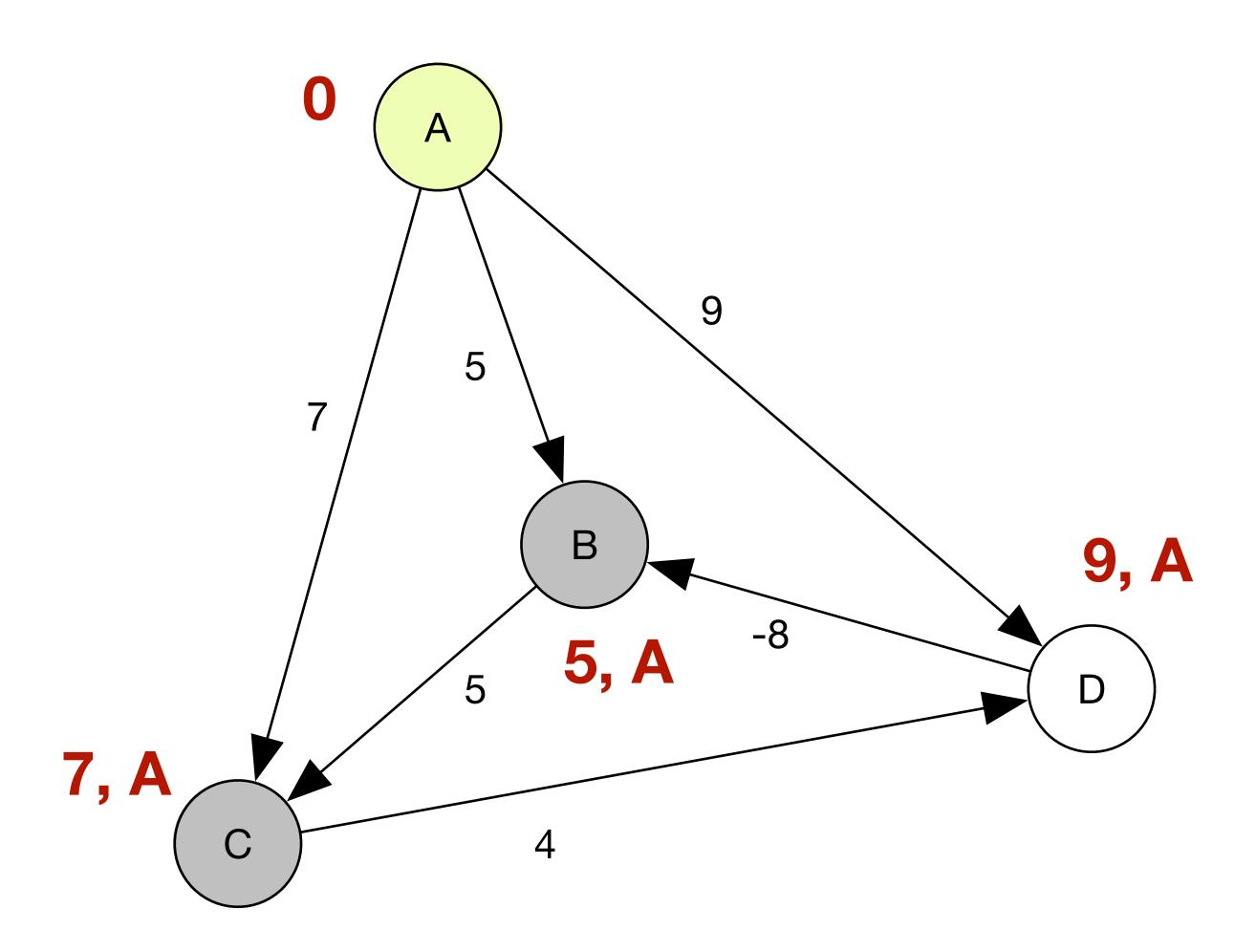
$$U = \{B, C, D\}$$



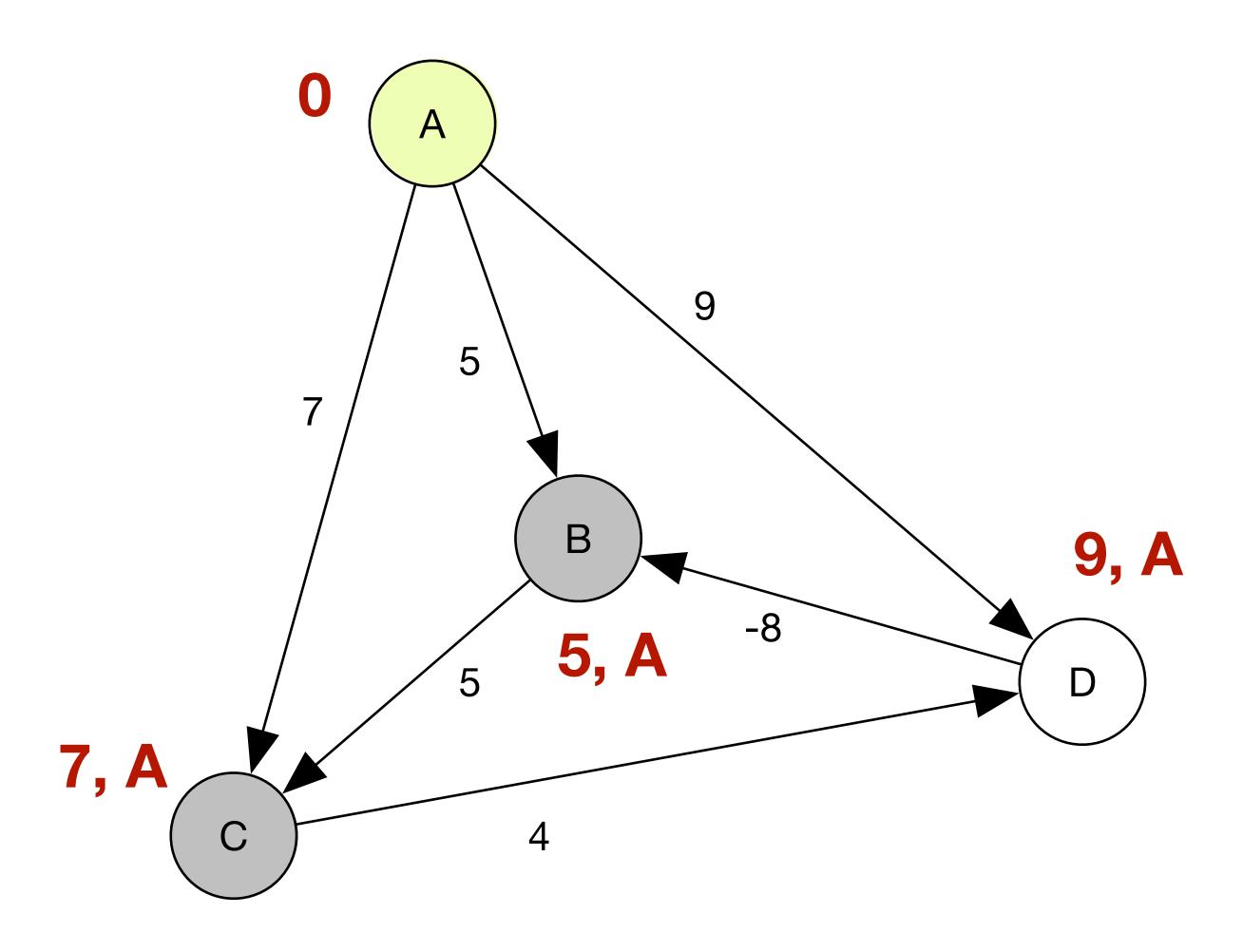
$$U = \{C, D\}$$



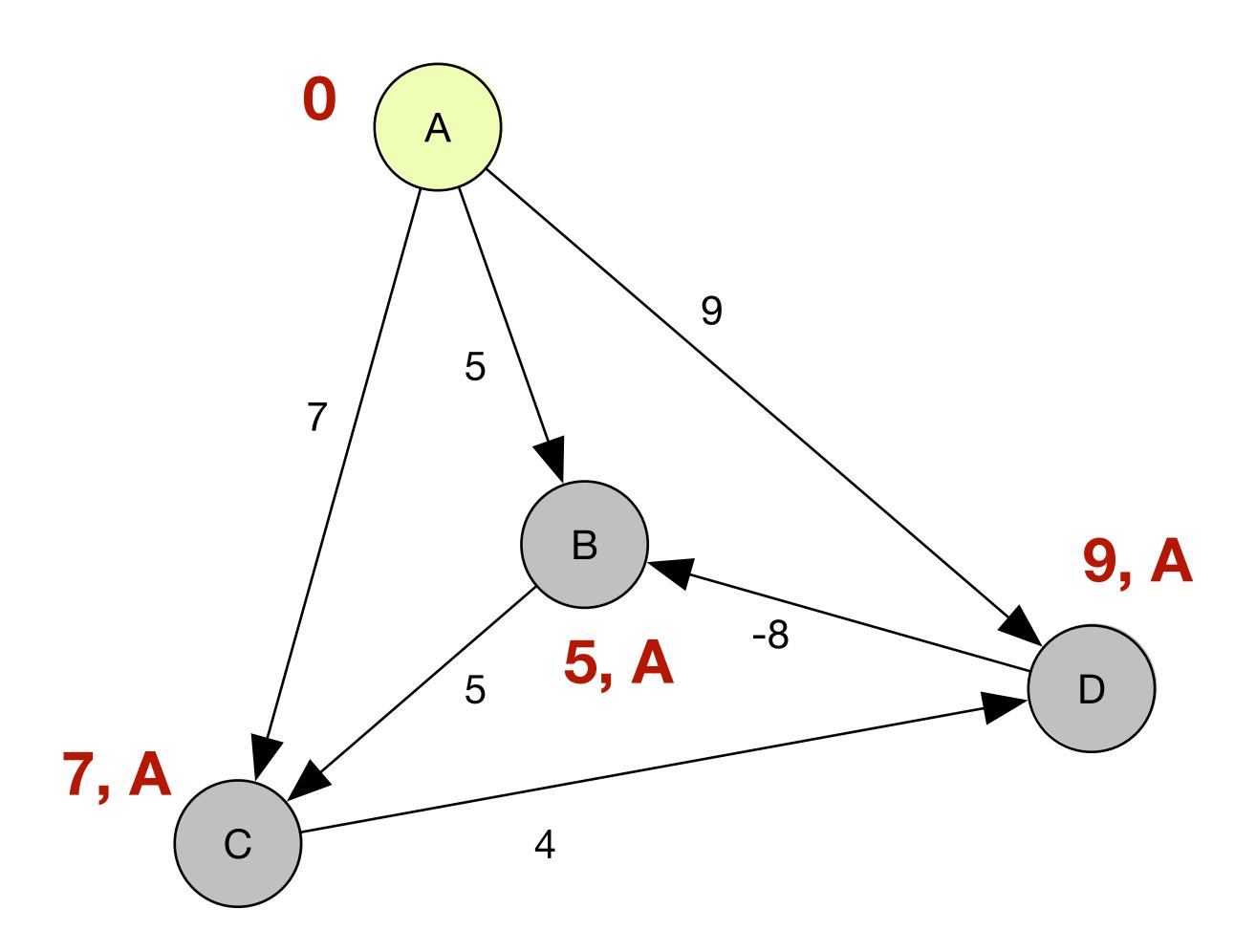
$$U = \{D\}$$



$$\mathsf{U} = \{\}$$

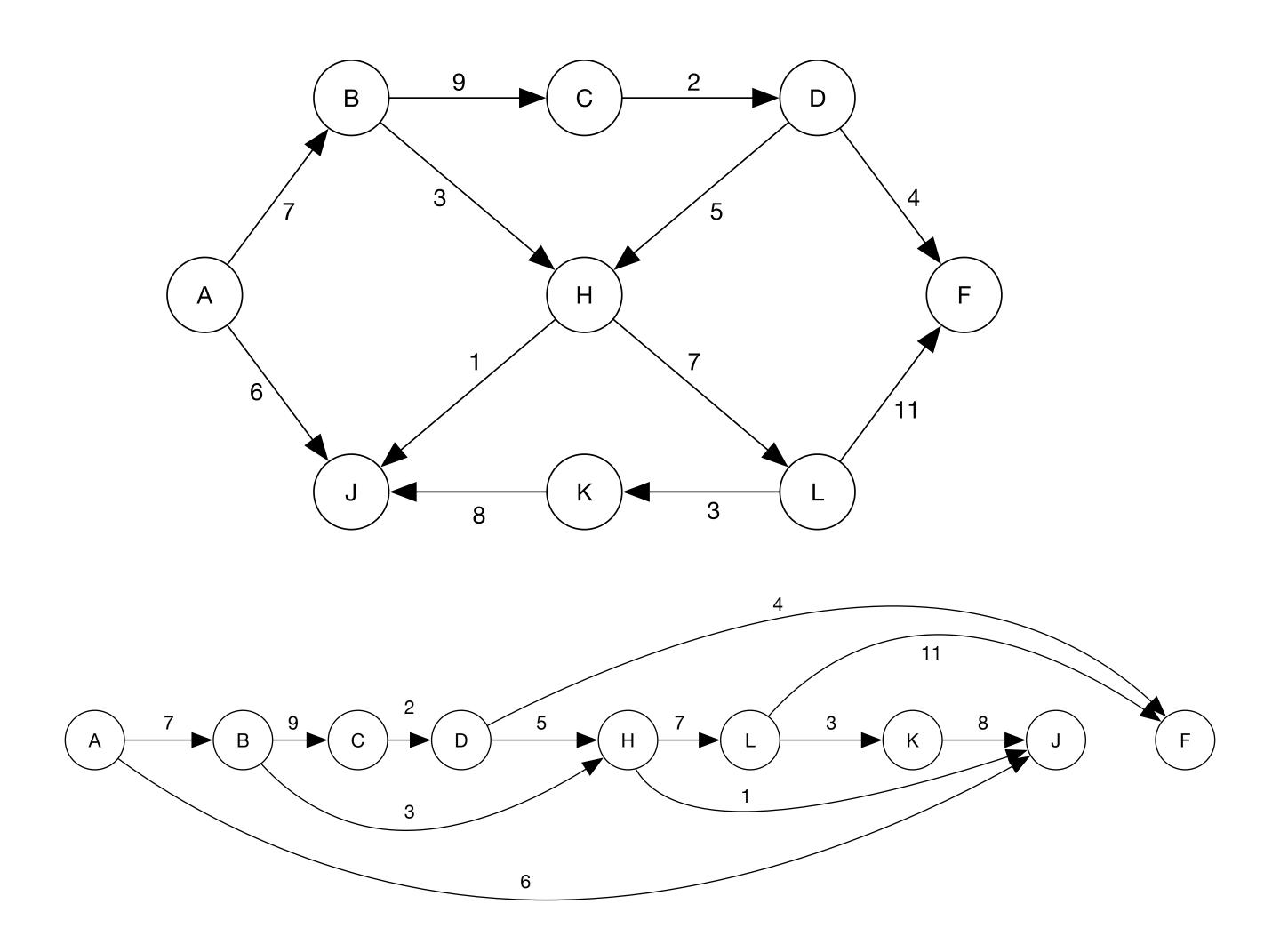


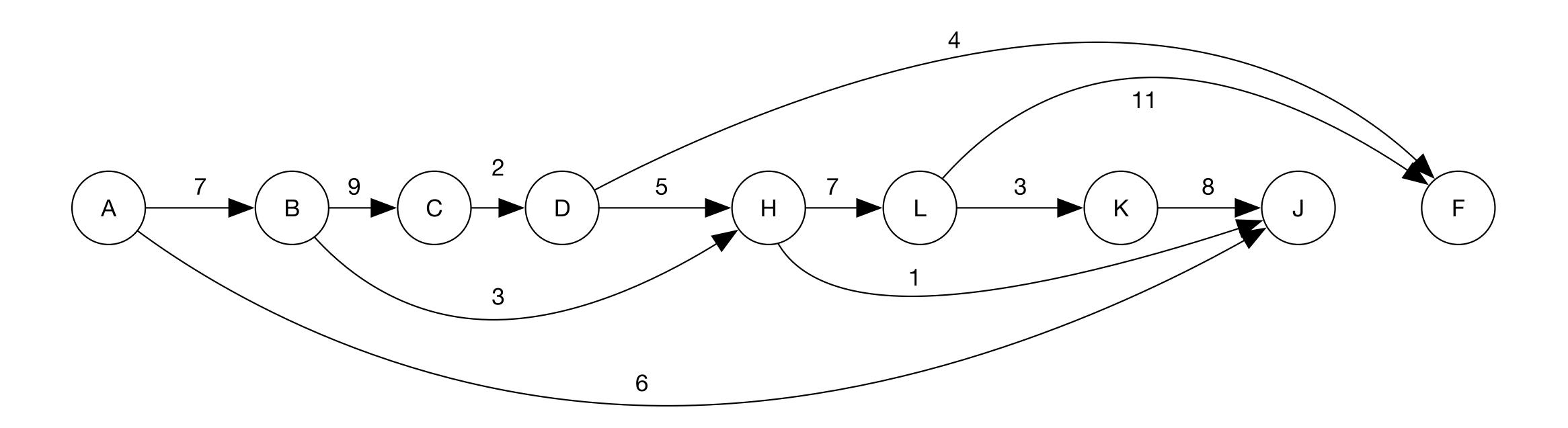
$$\mathsf{U} = \{\}$$

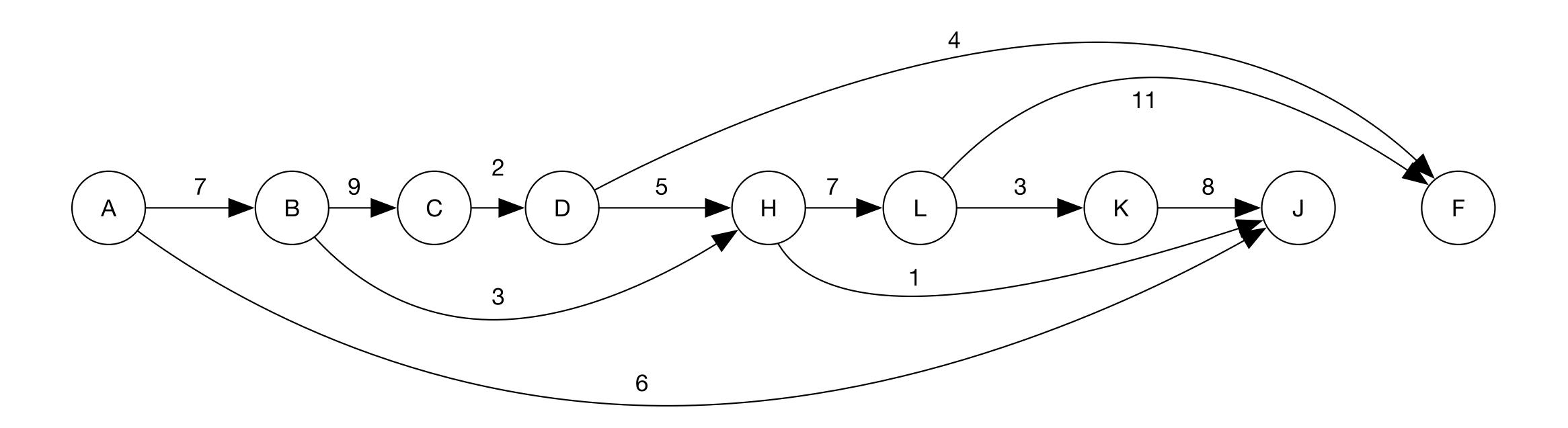


Worst case complexity (using min priority queue)

$$\mathcal{O}((|V| + |E|) \log |V|)$$







Worst case complexity directed graph with cycles (using min priority queue)

$$\mathcal{O}((|V| + |E|) \log |V|)$$

Worst case complexity directed acyclic graph (using topological sort)

$$\mathcal{O}(|V| + |E|)$$

Greedy approach. Grab the best answer so far; never backtrack.

Dynamic programming. Save partial solutions along the way and reconstruct complete solutions from the partial solutions.

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What to do about negative weights?

Greedy approach. Grab the best answer so far; never backtrack.

Dynamic programming. Save partial solutions along the way and reconstruct complete solutions from the partial solutions.

What to do about negative weights? Bellman-Ford algorithm.