



Aalto University  
School of Science

# *The shortest path problem*

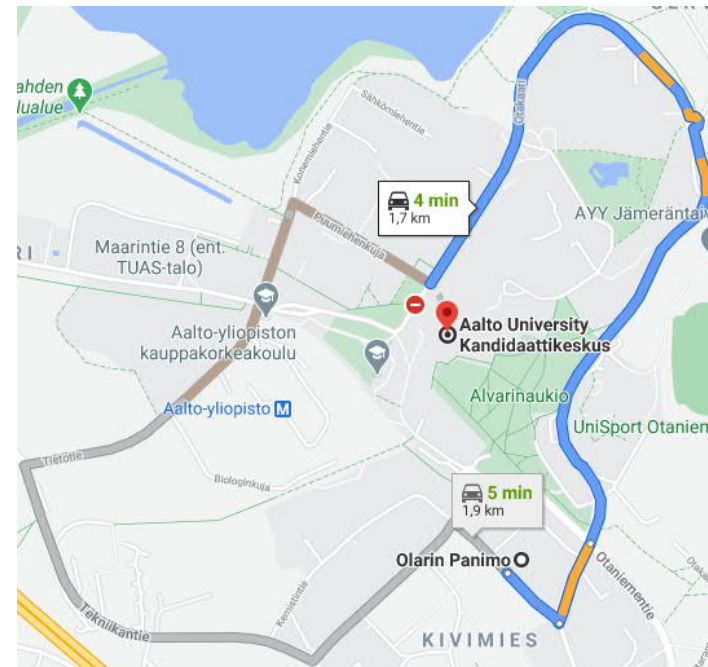
*Emil Nyman*  
Presentation 10  
16.10.2020

MS-E2191 Graduate Seminar on Operations Research  
Fall 2020

*The document can be stored and made available to the public on the open internet pages of Aalto University. All other rights are reserved.*

# Motivation

What is the fastest route from point A to point B?



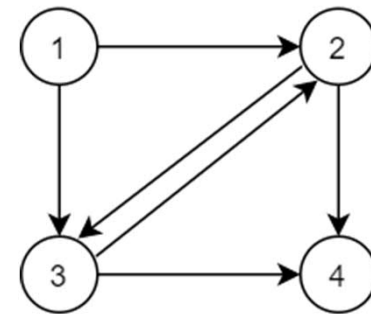
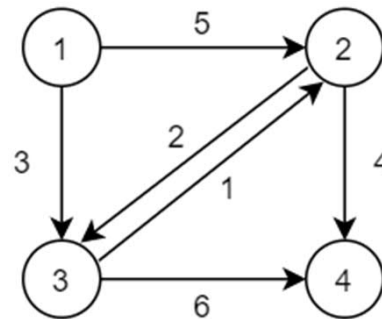
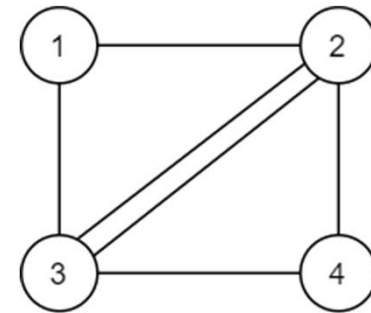
# Content

1. Background
2. Problem formulation
3. Generic algorithm
4. Implementations of the general algorithm
5. Applications

# Background

# Graph theory

- **Mathematical structures modeling relations between objects**
- **A graph consists of nodes and arcs**
- **Can be undirected or directed**
- **Can be cyclic or acyclic**
- **Arcs can have costs**



# Problem formulation

# Shortest path problem

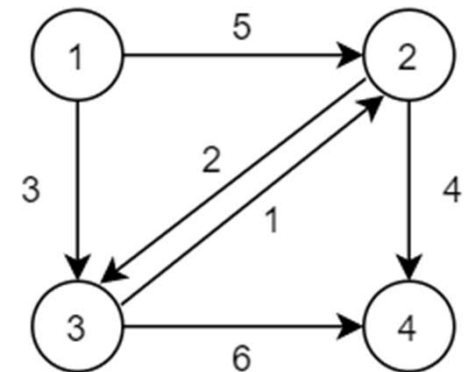
- We are given a directed graph  $(N, A)$  with nodes numbered  $1, \dots, N$  and arcs  $(i, j) \in A$  with a cost  $a_{ij}$ . The cost of a forward path  $(i_1, i_2, \dots, i_k)$  is the cost of its arcs

$$\sum_{n=1}^{k-1} a_{i_n i_{n+1}}.$$

- This path is the shortest if it has a minimum length over all forward paths with the same origin and destination nodes

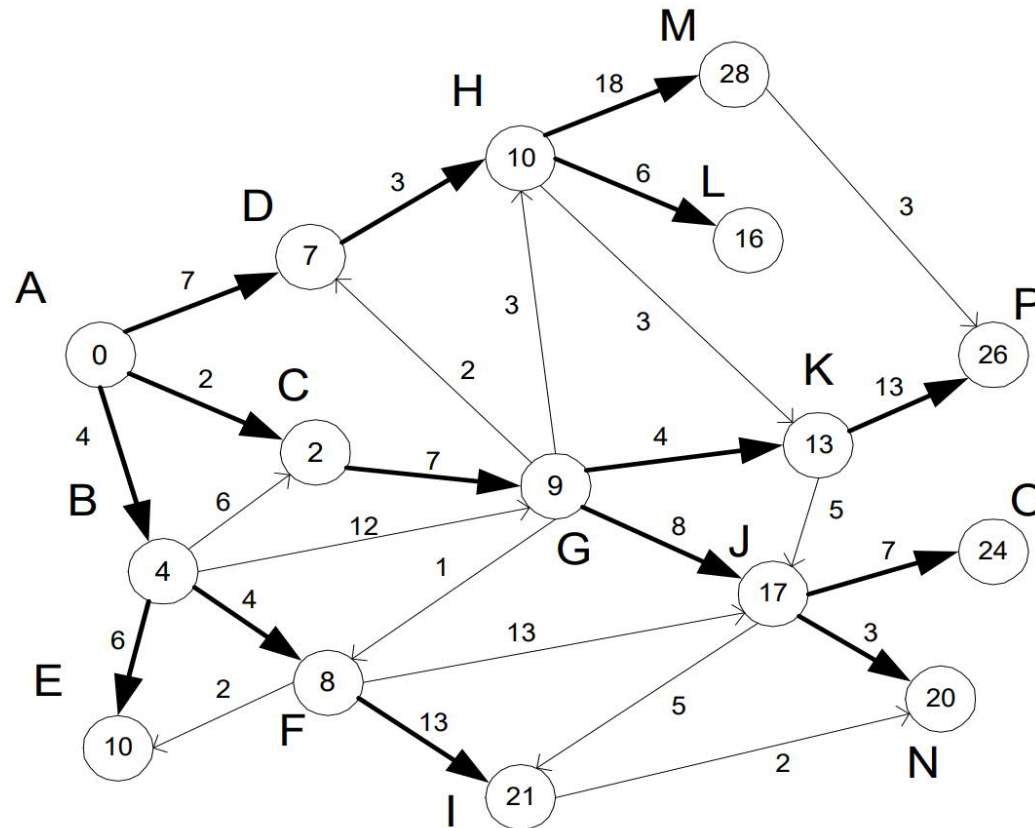
# Example

- What is the shortest path from node 1 to node 4?
- Trial and error
- Easy to solve





# Larger problems?



# Generic algorithm

# Generic shortest path algorithm 1/4

- The algorithm maintains a label  $d_i$  for each node  $i \in N$  that is assumed to be a non-negative scalar that represents the cost of some path  $P$  from the start node to  $i$
- In the beginning labels  $d_i = \infty \forall i \neq 0$  and  $d_0 = 0$
- Let the labels satisfy the complementary slackness (CS) condition for the shortest path problem

$$d_j \leq d_i + a_{ij} \quad \forall (i, j) \in A.$$

If

$$d_j = d_i + a_{ij} \quad \forall (i, j) \in P$$

then  $P$  is the shortest path from start node to  $i$ .

# Generic shortest path algorithm 2/4

- The algorithm goes through every arc to check violations of the CS condition
- If arc  $(i, j)$  violates the CS condition i.e.  $d_j > d_i + a_{ij}$ , then set  $d_j := d_i + a_{ij}$  until the CS condition is satisfied for all arcs
- For efficiency we maintain a list of nodes  $V$ , called candidate list from which the algorithm chooses one node at a time and checks for CS conditions

# Generic shortest path algorithm 3/4

- **One iteration of the generic algorithm:**

Remove a node  $i$  from candidate list  $V$ . For each outgoing arc, if  $d_j > d_i + a_{ij}$ , set

$$d_j := d_i + a_{ij}$$

and add  $j$  to  $V$  if it does not already belong to  $V$ .

- **Continue iteration until  $V$  is empty**

# Generic shortest path algorithm 4/4

- Upon termination, all labels are equal to the corresponding shortest distances

$$d_j = \begin{cases} \min_{(i,j) \in A} \{d_i + a_{ij}\}, & \forall j \neq 1 \\ 0, & j = 1 \end{cases}$$

and thus, the shortest path can be achieved by following arcs back from the final node so that

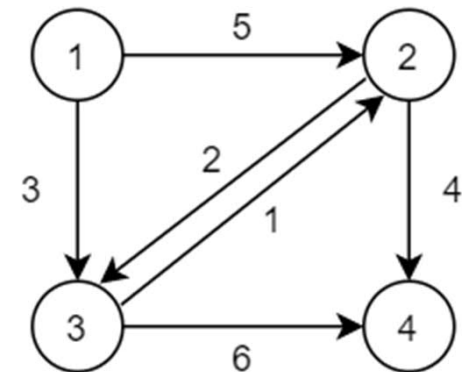
$$d_j = d_i + a_{ij}.$$

# Example revised

- Solving the shortest path problem from node 1 to node 4 using the generic algorithm
- One iteration of the generic algorithm:  
Remove a node  $i$  from candidate list  $V$ . For each outgoing arc, if  $d_j > d_i + a_{ij}$ , set

$$d_j := d_i + a_{ij}$$

and add  $j$  to  $V$  if it does not already belong to  $V$ .



# Implementations of the general algorithm



# Implementations 1/3

- **The only difference in different implementations of the generic algorithm is how a node is removed from the candidate list  $V$**
- **Can be categorized in two groups**
  - Label setting methods
  - Label correcting methods
- **Label setting methods have a better worse-case running time**
- **Label correcting methods are more flexible, better suited for advanced initialization and in practice have a faster running time**

# Implementations: Label setting methods 2/3

- Also called Dijkstra's algorithm
- Node removed from  $V$  is always the one with the minimum label
- Each node enters  $V$  at most once
- Implementations differ in obtaining the minimum at each iteration
  - Binary heap
  - Dial's algorithm

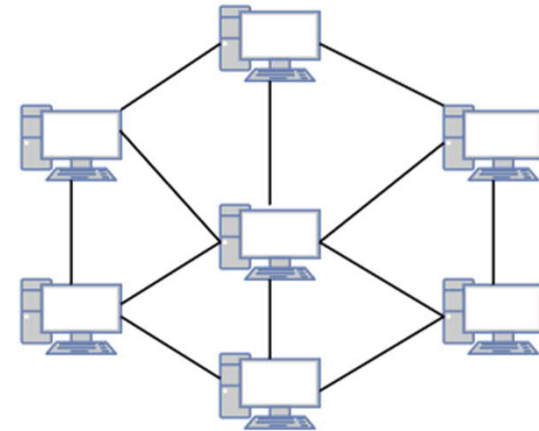
# Implementations: Label correcting method 3/3

- **Node removed from  $V$  is done sorting the nodes in it**
- **Each node can enter  $V$  multiple times**
- **Label correcting methods**
  - Bellman-Ford: first-in first-out
  - D'Esopo-Pape: first-in first-out unless node has already been in  $V$ , then last-in first-out
  - SLF: if label is smaller than current smallest of  $V$  set new node first in queue, otherwise last
  - LLL: if first label is larger than the average of  $V$ , re-organize  $V$  so that the first is last. Repeat until first node is smaller than average

# Applications

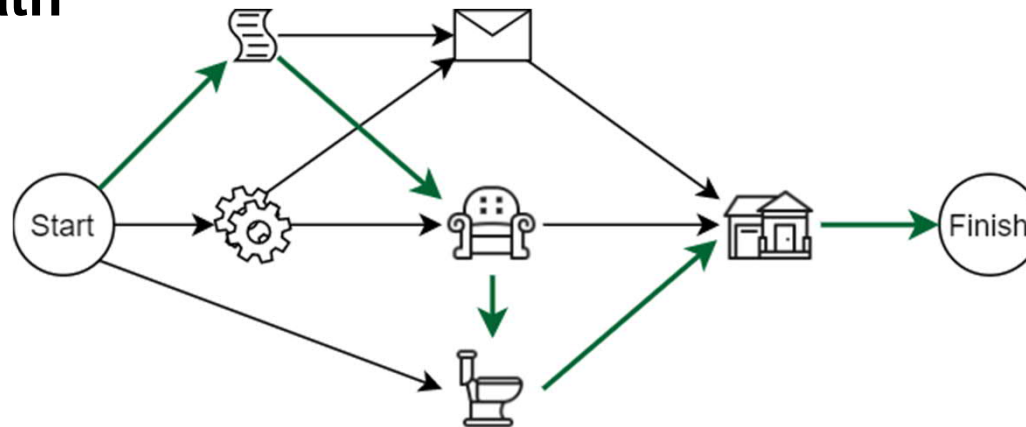
# Applications: Data Networks

- **Nodes represent computers**
- **Arcs represent communication links**
- **Costs can represent: length, transmission capacity, traffic etc.**
- **Costs can differ over time**



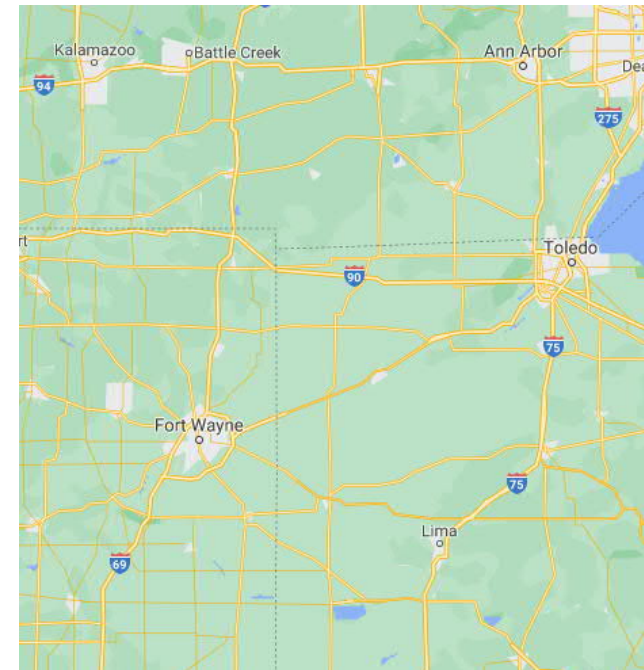
# Applications: Project management

- **Finding the longest path from start to finish**
  - Can be viewed as a shortest path problem with negative cost
  - Must be acyclic
- **Critical path**



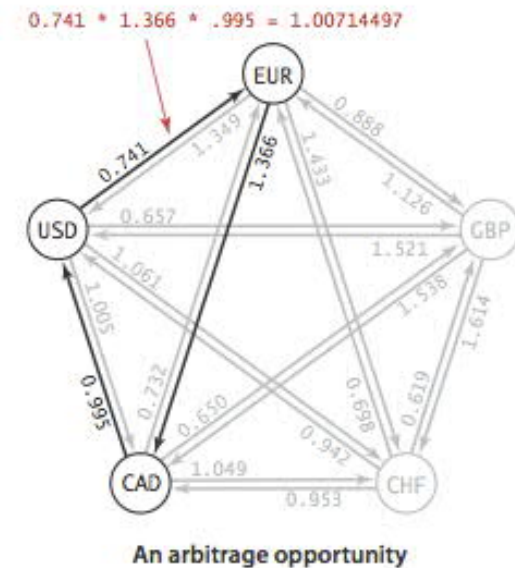
# Applications: Road networks

- **Nodes represent junctions**
- **Arcs represent the roads**
- **Costs represent length, travel time etc.**
- **One-way roads with directional arcs**



# Applications: Arbitrage detection

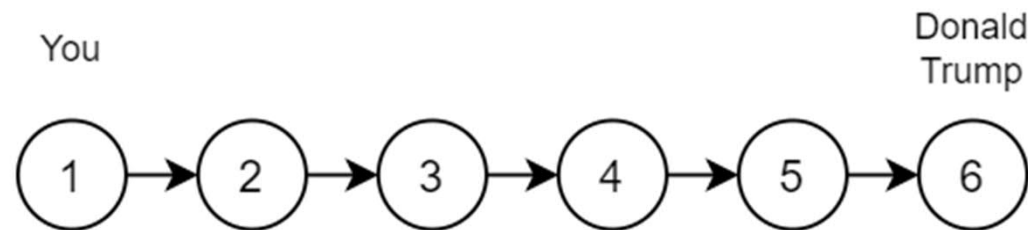
- Arbitrage = making money without risk
- Finding arbitrages by detecting negative cycles
  - E.g. Bellman-Ford method if the algorithm continues over  $N$  cycles





# Applications: Social networks

- **Six degrees of separation**



# Thank you!

# References

## Content based on:

Bertsekas, Dimitri P. *Network optimization: continuous and discrete models*. Belmont, MA: Athena Scientific, 1998.

## Larger network problem image:

Xiao, Bin, Qingfeng ZhuGe, and EH-M. Sha. "Minimum dynamic update for shortest path tree construction." *GLOBECOM'01. IEEE Global Telecommunications Conference (Cat. No. 01CH37270)*. Vol. 1. IEEE, 2001.

## Map image:

<https://www.google.fi/maps>

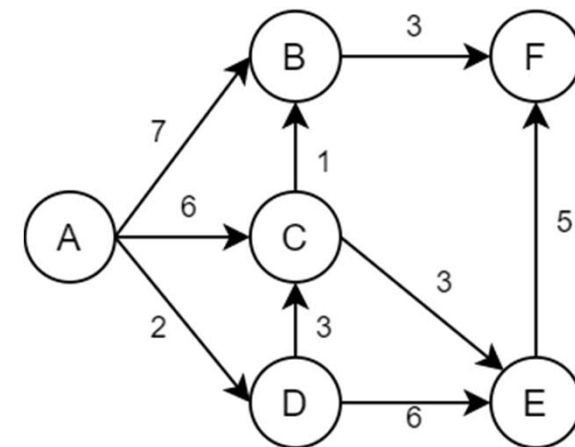
## Arbitrage image:

<https://algs4.cs.princeton.edu/44sp/>

# Homework: Dijkstra's shortest path algorithm

Given the following graph, where arcs connecting nodes A to F have different costs, find the shortest path from node A to node F by using Dijkstra's algorithm.

Report the labels  $d_i$  and the candidate list  $V$  in each iteration. What path is the shortest based on Dijkstra's algorithm?



DL 23.10. answers to: [emil.nyman@aalto.fi](mailto:emil.nyman@aalto.fi)