

1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32 33 34 35 36 37 38 39 40 41 42 43 44 45 46 47 48 49 50 51 52 53 54 55 56 57 58 59 60 61 62 63 64 65 66 67 68 69 70 71 72 73 74 75 76 77 78 79 80 81 82 83 84 85 86 87 88 89 90 91 92 93 94 95 96 97 98 99 100

# Algorithms

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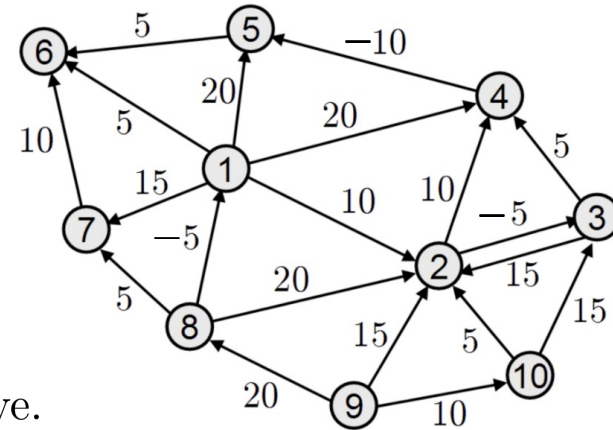
[illegible]

# Algorithms

## SINGLE SOURCE SHORTEST PATHS (SSSP)

Given directed graph with weights on the edges, the goal is to compute all shortest paths from a specific node  $s$  to all other nodes.

The weights on the edges can be positive or negative.



## SINGLE SOURCE SHORTEST PATHS (SSSP)

Recall Dijkstra:

**Input:** Directed graph  $G = (V, E)$ , edge lengths  $c_e$  for each  $e \in E$ , source vertex  $s \in V$ .

**Goal:** For every destination  $v \in V$ , compute the length (sum of edge costs) of a shortest  $s$ - $v$  path.

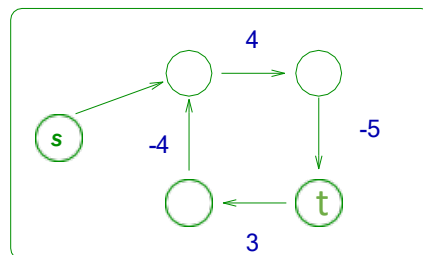
# DIJKSTRA ALGORITHM

## Facts:

- $O(m+n)\log n$  ( $n$  = number of vertices,  $m$  = number of edges)
- $O(m \log n)$  running time using heaps
- Not always correct with negative edge lengths
  - Application: if edges  $\mapsto$  financial transactions

**Solution:** The Bellman-Ford algorithm

# NEGATIVE CYCLES



**Question:** How to define shortest path when  $G$  has a negative cycle?

**Solution #1:** Compute the shortest  $s$ - $v$  path, in the presence of cycles.

**Problem:** Undefined or  $-\infty$ . [will keep traversing negative cycle]

**Solution #2:** Compute shortest cycle-free  $s$ - $v$  path [in the presence of -ve cycles]

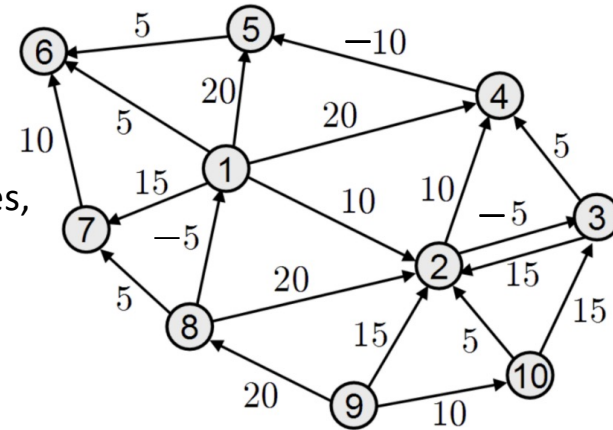
**Problem:** NP-hard (no polynomial algorithm) [to be discussed later]

**Solution #3:** Assume input graph has no negative cycles [overall cycle cost].

## SINGLE SOURCE SHORTEST PATHS (SSSP)

Given a graph  $G$  with  $n$  nodes and  $m$  edges and no negative cycles, which of the following statement is the strongest:

1. For every  $v$ , there is a shortest path  $s-v$  with  $\leq n-1$  edges
2. For every  $v$ , there is a shortest path  $s-v$  with  $\leq n$  edges
3. For every  $v$ , there is a shortest path  $s-v$  with  $\leq m$  edges
4. No limit can be applied on the shortest path



## SINGLE SOURCE SHORTEST PATHS (SSSP)

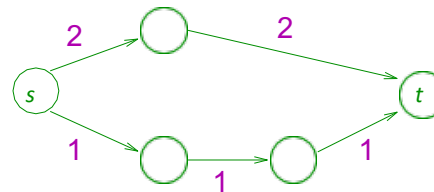
**Input:** Directed graph  $G = (V, E)$ , edge lengths  $c_e$  [possibly negative], source vertex  $s \in V$ .

**Goal:** For all destinations  $v \in V$ , compute the length of a shortest  $s$ - $v$  path

# DYNAMIC PROG SOLUTION

- **Intuition:** Requires some kind of ordering to divide the problem into smaller subproblems
- **Issue:** Not clear how to define “smaller” & “larger” subproblems.
- **Solution:** Exploit sequential nature of paths. Subpath of a shortest path should itself be shortest.
- **Key idea:** Artificially restrict the number of edges in a path.
- Subproblem size  $\Leftrightarrow$  Number of permitted edges
- **Example:**

- Shortest path with 2 or less edges from s to t
- 3 or less





# OPTIMAL SUBSTRUCTURE

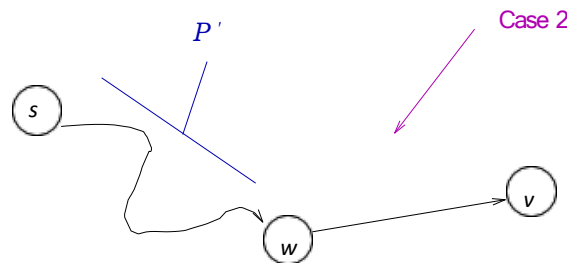
**Lemma:** Let  $G = (V, E)$  be a directed graph with edge lengths  $c_e$  and source vertex  $s$ .

For every  $v \in V$ ,  $i \in \{1, 2, \dots\}$ , let

$P =$  shortest  $s$ - $v$  path with at most  $i$  edges. (Cycles are permitted.)

**Case 1:** If  $P$  has  $\leq (i - 1)$  edges, it is a shortest  $s$ - $v$  path with  $\leq (i - 1)$  edges.

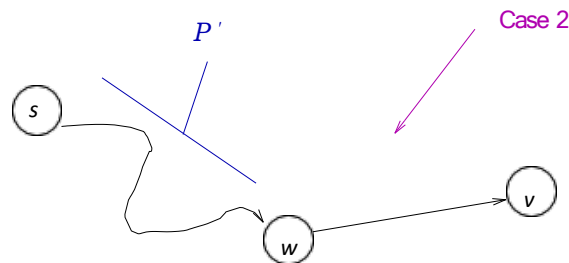
**Case 2:** If  $P$  has  $i$  edges with last hop  $(w, v)$ , then  $P'$  is a shortest  $s$ - $w$  path with  $\leq (i - 1)$  edges.



# OPTIMAL SUBSTRUCTURE

**Case 1:** By (obvious) contradiction [assume there is a shorter  $i-1$  path,  $H$ , then  $H < P$ , so  $H$  should be the shortest  $i$  path-Contradiction].

**Case 2:** If  $Q$  (from  $s$  to  $w$ ,  $\leq (i-1)$  edges) is shorter than  $P^J$  then  $Q + (w, v)$  (from  $s$  to  $v$ ,  $\leq i$  edges) is shorter than  $P^J + (w, v)$  ( $= P$ ) which contradicts the optimality of  $P$ . **QED!**



## SINGLE SOURCE SHORTEST PATHS (SSSP)

Given all shortest paths of length  $\leq i-1$  from S.

How many candidate paths of length  $\leq i$  do we have to a node v:

1. 5
2.  $1 + \text{in-degree}(v)$
3. n
4. m
5. n-1

# RECURRENCE

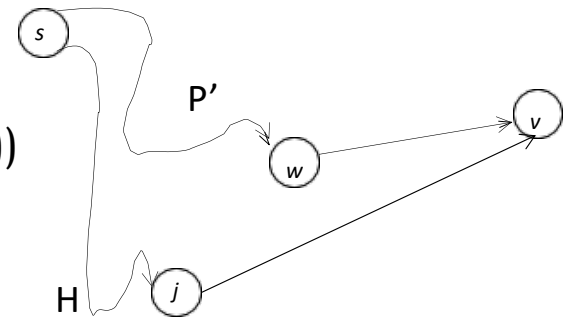
**Notation:** Let  $L_{i,v}$  = minimum length of a  $s$ - $v$  path with  $\leq i$  edges.

- Defined as  $+\infty$  if no  $s$ - $v$  paths with  $\leq i$  edges

**Recurrence:** For every  $v \in V$ ,  $i \in \{1, 2, \dots\}$

$$L_{i,v} = \min \begin{cases} L_{(i-1),v} & \text{Case 1} \\ \min_{(w,v) \in E} \{ L_{(i-1),w} + c_{wv} \} & \text{Case 2} \end{cases}$$

**Correctness:** Brute-force search from the only  $(1 + \text{in-deg}(v))$  candidates (by the optimal substructure lemma).



# RECURRENCE

**Now:** Recall that graph  $G$  has no negative cycles.

$\Rightarrow$  Shortest paths do not have cycles

[removing a cycle only decreases length]

$\Rightarrow$  Have  $\leq (n - 1)$  edges

**Point:** If  $G$  has no negative cycle, only need to solve subproblems up to  $i = n - 1$ .

**Subproblems:** Compute  $L_{i,v}$  for all  $i \in \{0, 1, \dots, n - 1\}$  and all  $v \in V$ .

# The Bellman-Ford Algorithm

Let  $A$  = 2-D array (indexed by  $i$  and  $v$ )

**Base case:**  $A[s, 0] = 0$ ;  $A[v, 0] = +\infty$  for all  $v \neq s$

For  $i = 1, 2, \dots, n - 1$

For each  $v \in V$

$$A[v, i] = \min \begin{cases} A[v, i - 1] \\ \min_{(w,v) \in E} \{A[w, i - 1] + c_{wv}\} \end{cases}$$

	1	...	...	n-1
$v_1$				
$\cdot$				
$\cdot$				
$\cdot$				
$v_n$				

**As discussed:** If  $G$  has no negative cycle, then algorithm is correct [with final answers =  $A[v, n - 1]$ 's]

## Example

$$A[v, i] = \min \begin{cases} A[v, i-1] \\ \min_{(w,v) \in E} \{A[w, i-1] + c_{wv}\} \end{cases}$$

