

# Floyd-Warshall Algorithm For Solving the All-Pairs Shortest Path Problem

<https://cs.pomona.edu/classes/cs140/>

# Outline

## Topics and Learning Objectives

- Discuss and analyze the Floyd-Warshall Algorithm

## Exercise

- None

# All-Pairs Shortest Path Problem

Compute the shortest path from every vertex to every other vertex

- Input: a weighted graph (no need for a start vertex)
- Output:
  - Shortest path from  $u \rightarrow v$  for all values of  $u$  and  $v$
  - Or report that a negative cycle has been discovered
- Can we solve this problem with what we know already?

# SSSP $\rightarrow$ APSP

How do we turn a solution to the single-source shortest path (SSSP) problem into a solution for the all-pairs shortest path (APSP) problem?

- This is called a reduction!
- How many times do we need to run a SSSP procedure for APSP?
  - a. 1
  - b.  $n - 1$
  - c.  $n$
  - d.  $n^2$

# SSSP algorithms

Running time of APSP if we **don't** allow negative edges?

- $n * O(\text{Dijkstra's Algorithm}) = O(n m \lg n)$
- For **sparse** graphs:  $O(n^2 \lg n)$
- For **dense** graphs:  $O(n^3 \lg n)$

Running time of APSP if we **do** allow negative edges?

- $n * O(\text{Bellman-Ford}) = O(n^2 m)$
- For **sparse** graphs:  $O(n^3)$
- For **dense** graphs:  $O(n^4)$

# Consider APSP on **dense** graphs.

- How many values are we going to output?  $n^2$
- What is the potential length of a shortest path?  $n - 1$
- What is the lower bound on the running time of APSP?
- It is tempting to say that the lower bound is  $n^3$
- However, this lower bound has yet to be determined
- Consider the matrix multiplication procedure developed by Strassen

# Specialized APSP Algorithm

- Although we can use Bellman-Ford and Dijkstra's algorithms, there are, in fact, specialized APSP algorithms
- The Floyd-Warshall algorithm solves the APSP problem deterministically in  $O(n^3)$  on all types of graph
- It works with negative edge lengths
- Meaning that it is as good as Bellman-Ford for sparse graphs,
- And much better than Bellman-Ford for dense graphs.

# Question

	Sparse Graphs	Dense Graphs
Dijkstra's $n$ times	$O(n^2 \lg n)$	$O(n^3 \lg n)$
Bellman-Ford $n$ times	$O(n^3)$	$O(n^4)$
Floyd-Warshall	$O(n^3)$	$O(n^3)$

- What algorithm would you choose for sparse graphs?
  - Dijkstra's  $n$  times if there are no negative edges, Floyd-Warshall otherwise
- What algorithm would you choose for dense graphs?
  - Always Floyd-Warshall



# Optimal Substructure for APSP

Key concept:

- label the vertices 1 through  $n$  (giving them an arbitrary order),
- and then introduce the notation  $V^{(k)} = \{1, 2, \dots, k\}$

Optimal Substructure Lemma:

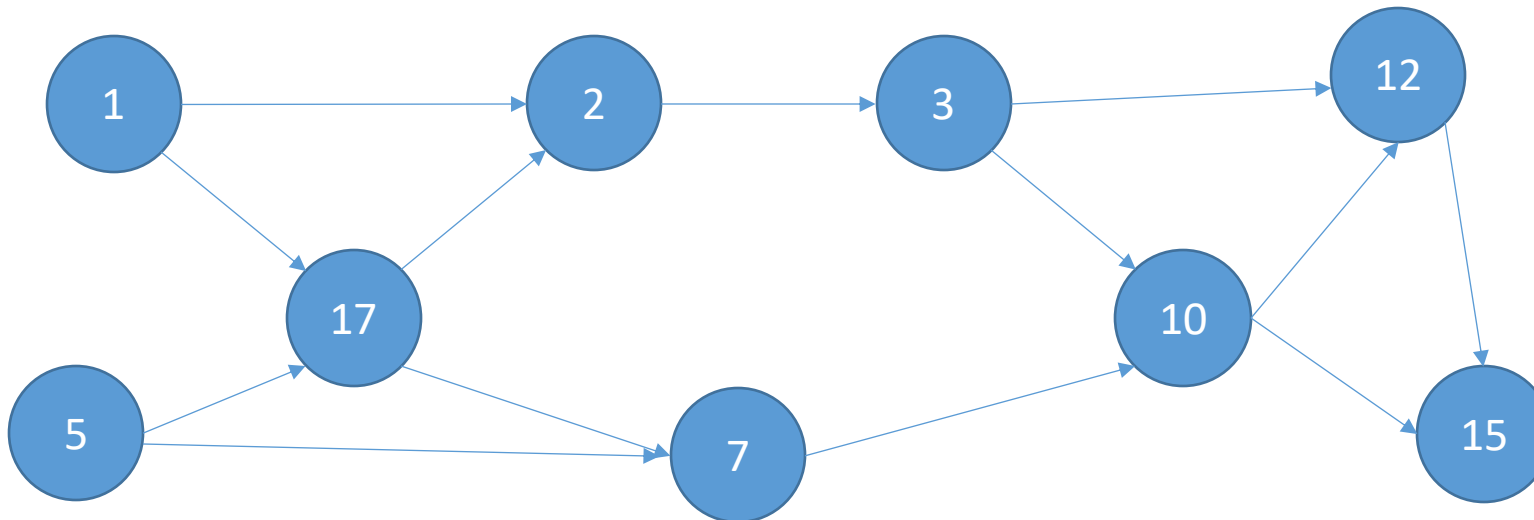
- Assume, for now, that the graph does **not** include a **negative cycle**
- Fix a source vertex  $i$ , a destination vertex  $j$ , and a value for  $k$
- Then let  $P$  be the shortest  $i \rightarrow j$  path with internal nodes from  $V^{(k)}$

$$V^{(k)} = \{1, 2, \dots, k\}$$

# Example Substructure

Optimal Substructure Lemma:

- Fix a source vertex  $i$ , a destination vertex  $j$ , and a value for  $k$
- Then let  $P$  be the shortest  $i \rightarrow j$  path with internal nodes from  $V^{(k)}$



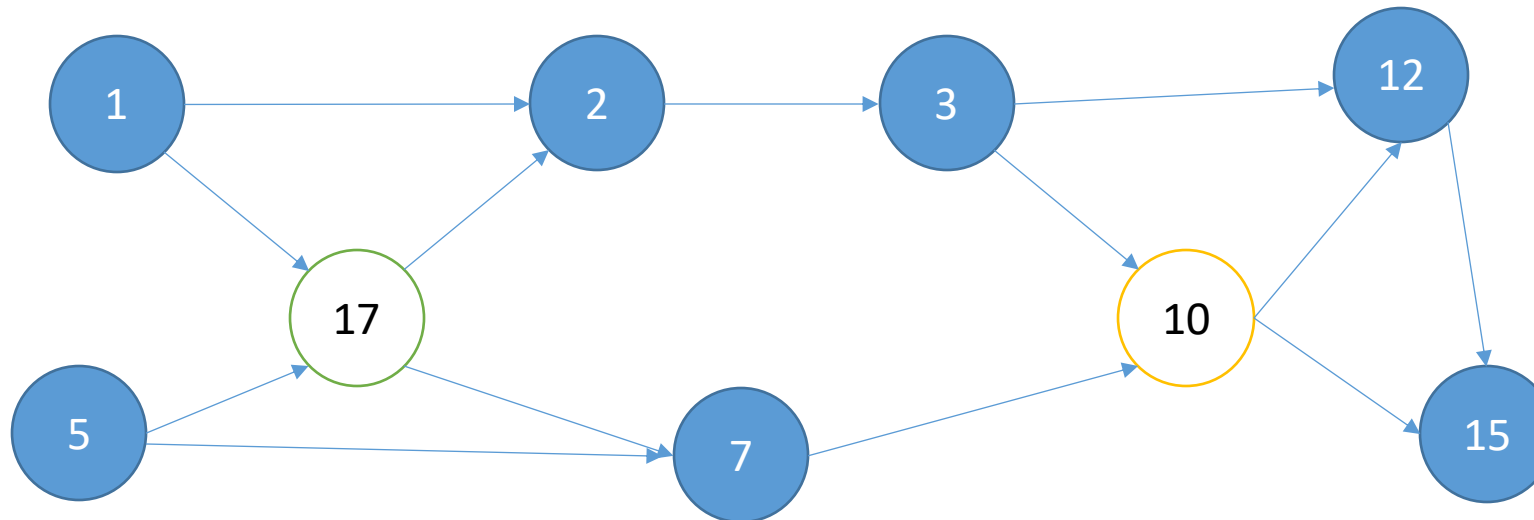
$$V^{(k)} = \{1, 2, \dots, k\}$$

# Example Substructure

Optimal Substructure Lemma:

- Fix a source vertex  $i$ , a destination vertex  $j$ , and a value for  $k$
- Then let  $P$  be the shortest  $i \rightarrow j$  path with internal nodes from  $V^{(k)}$

$i = 17$   
 $j = 10$



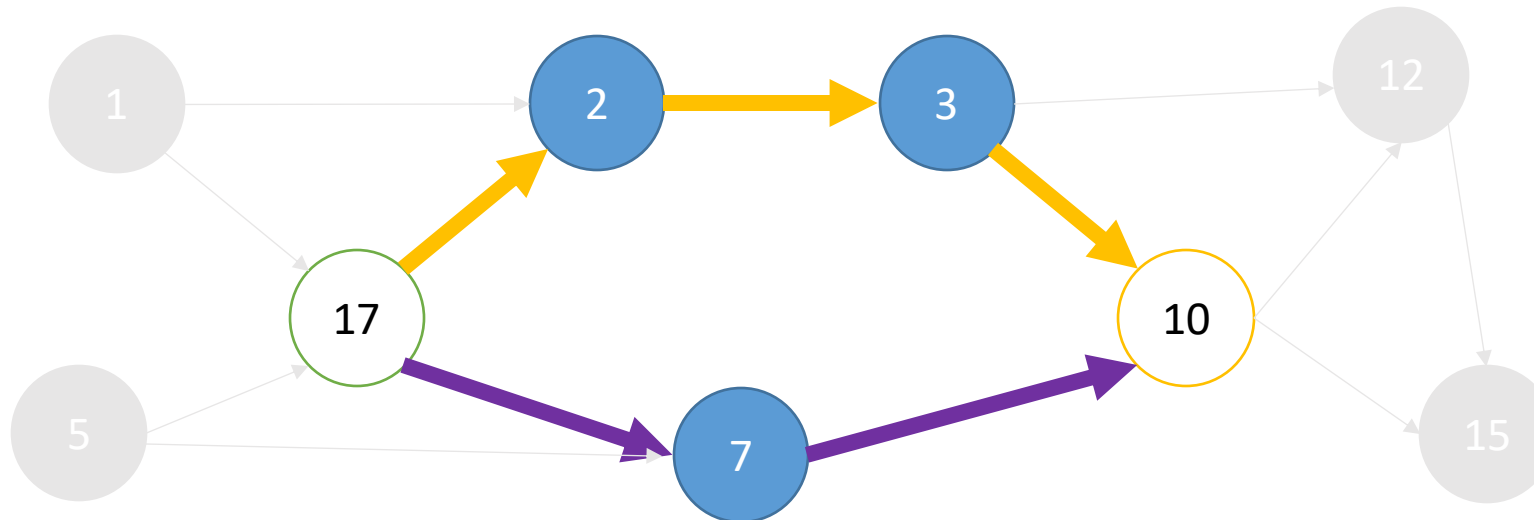
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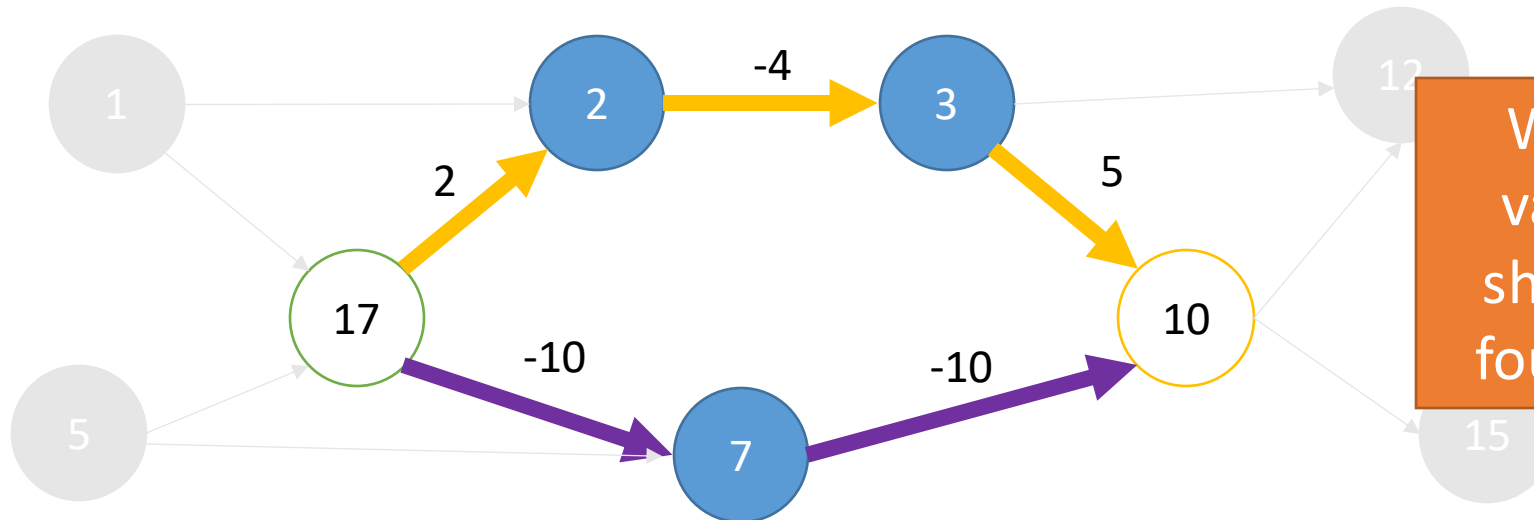
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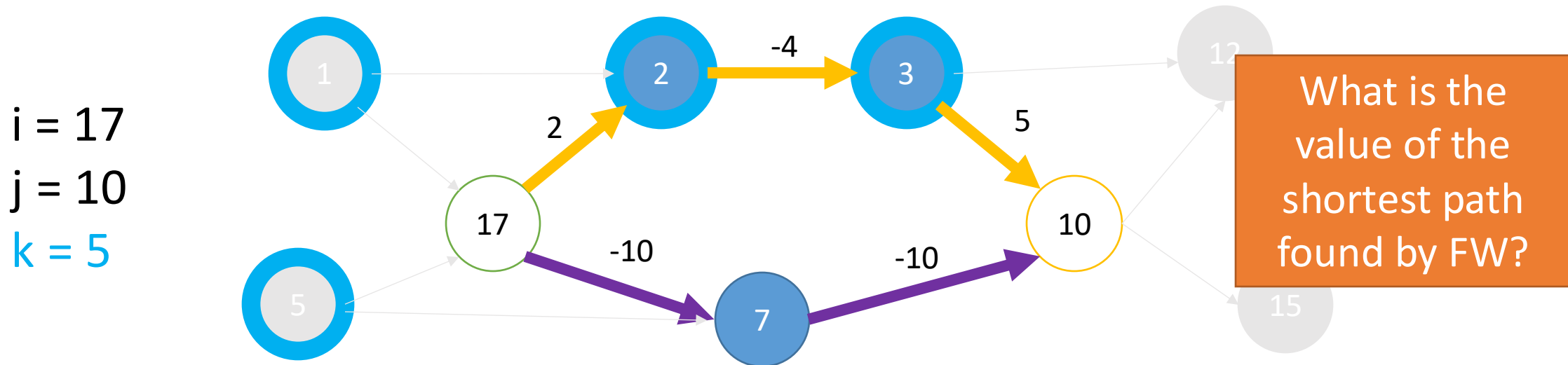
What is the value of the shortest path found by FW?

$$V^{(k)} = \{1, 2, \dots, k\}$$

# Example Substructure

Optimal Substructure Lemma:

- Fix a source vertex  $i$ , a destination vertex  $j$ , and a value for  $k$
- Then let  $P$  be the shortest  $i \rightarrow j$  path with internal nodes from  $V^{(k)}$

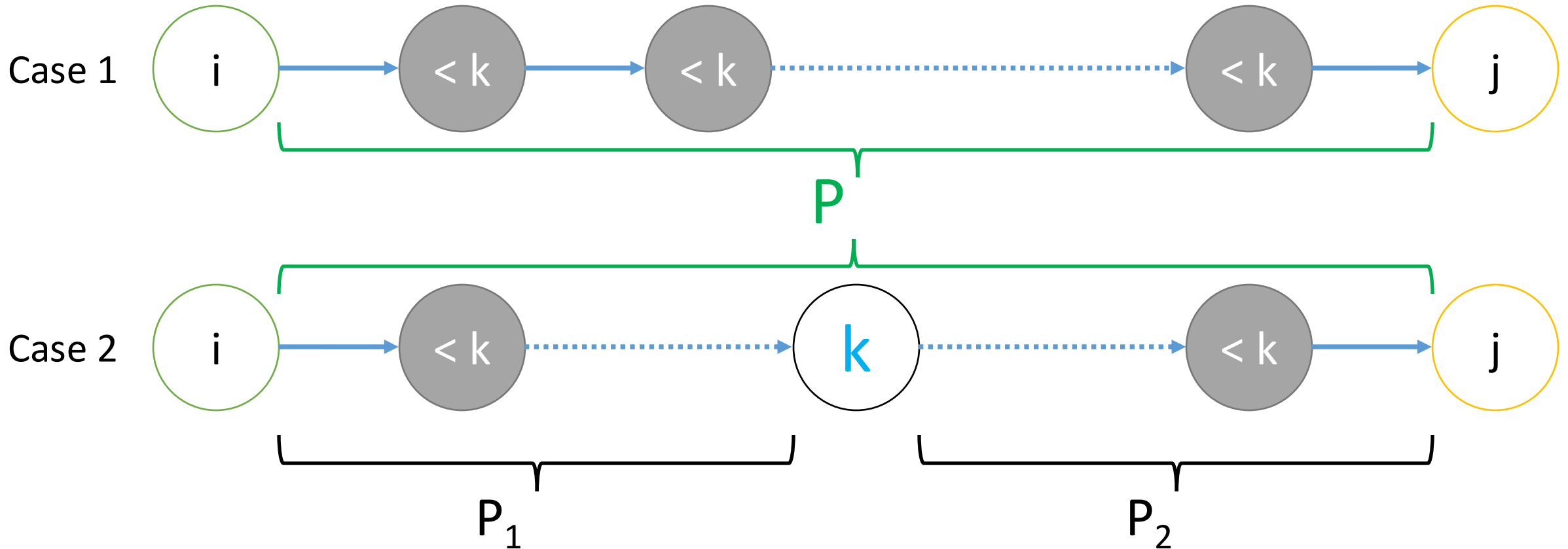


# Optimal Substructure Lemma

Suppose that  $G$  has no negative cycles. Let  $P$  be the shortest (cycle-free) path  $i \rightarrow j$ , where all internal nodes come from  $V^{(k)}$ . Then:

- Case 1: if  $k$  is not internal to  $P$ , then  $P$  is also a shortest path  $i \rightarrow j$  with all internal nodes from  $V^{(k-1)}$ .
- Case 2: if  $k$  is internal to  $P$ , then:
  - Let  $P_1$  = the shortest  $i \rightarrow k$  path with nodes from  $V^{(k-1)}$ , and
  - Let  $P_2$  = the shortest  $k \rightarrow j$  path with nodes from  $V^{(k-1)}$
  - Effectively,  $k$  splits the path into two optimal subproblems

# Picture of our cases





# Floyd-Warshall Algorithm Base Cases

Let  $A$  = 3D array, where  $A[i, j, k]$  = the length of the shortest  $i \rightarrow j$  path with all internal nodes from  $\{1, 2, \dots, k\}$

- Which index ( $i$ ,  $j$ , or  $k$ ) do you think represents our base case?

What is the value of  $A[i, j, 0]$  when...

- $i = j$ ?

0

- there is a direct edge from  $i$  to  $j$

$c_{ij}$

- there is no edge directly connecting  $i$  to  $j$

$\infty$

```

FUNCTION FloydWarshall(graph)
    # Base 1 indexing for vertices labeled 1 through n
    pathLengths = [n by n by (n + 1) array]

    # Base case
    FOR vFrom IN [1 ..= n]
        FOR vTo IN [1 ..= n]

            IF i == j
                length = 0

            ELSE IF graph.hasEdge(vFrom, vTo)
                length = graph.edges[vFrom][vTo].weight

            ELSE
                length = INFINITY

            pathLengths[vFrom][vTo][0] = length

    # Table building
    continued next slide...

```

```

FUNCTION FloydWarshall(graph)
    # Base 1 indexing for vertices labeled 1 through n
    pathLengths = [n by n by (n + 1) array]

    # Base case
    cut from previous slide...

    # Table building
    FOR k IN [1 ..= n]
        FOR vFrom IN [1 ..= n]
            FOR vTo IN [1 ..= n]

                # Case 1
                withoutK = pathLengths[vFrom][vTo][k - 1]

                # Case 2
                withKSubPathA = pathLengths[vfrom][k][k - 1]
                withKSubPathB = pathLengths[k][vTo][k - 1]

                pathLengths[vFrom][vTo][k] = min(
                    withoutK,
                    withKSubPathA + withKSubPathB
                )

```

# Floyd-Warshall Algorithm

Running time?

- $O(n^3)$

Correctness?

- Substructure lemma

- Where are the final answers?
- How does it handle negative cycles?
- Reconstruction is similar to other dynamic programming problems.

```
# Table building
FOR k IN [1 ..= n]
  FOR vFrom IN [1 ..= n]
    FOR vTo IN [1 ..= n]

      # Case 1
      withoutK = pathLengths[vFrom][vTo][k - 1]

      # Case 2
      withKSubPathA = pathLengths[vFrom][k][k - 1]
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      pathLengths[vFrom][vTo][k] = min(
        withoutK,
        withKSubPathA + withKSubPathB
      )
```