

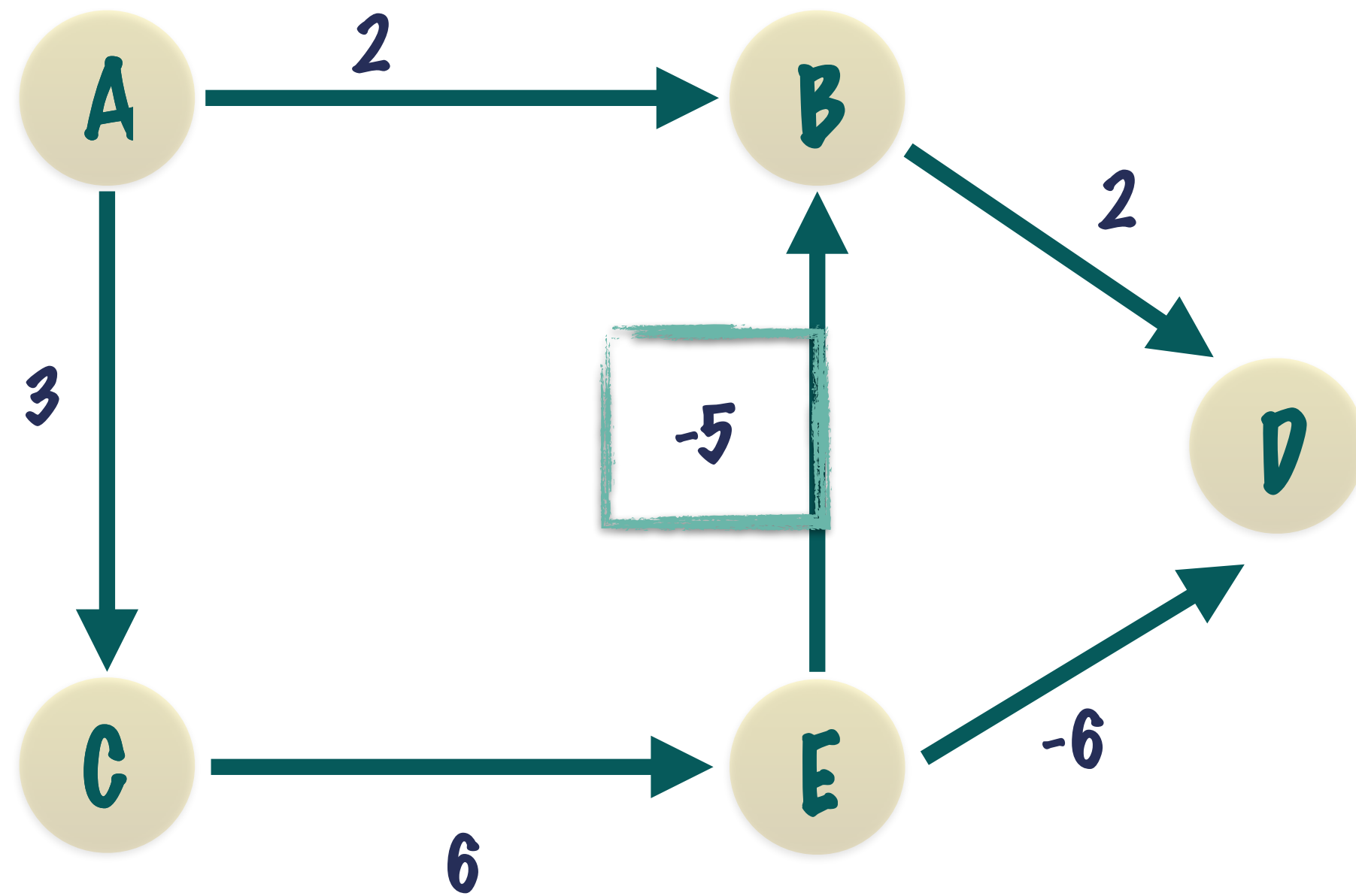
# THE GRAPH

SHORTEST PATH ALGORITHMS

SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



GRAPHS CAN HAVE NEGATIVE WEIGHTS ON THE EDGES AS WELL

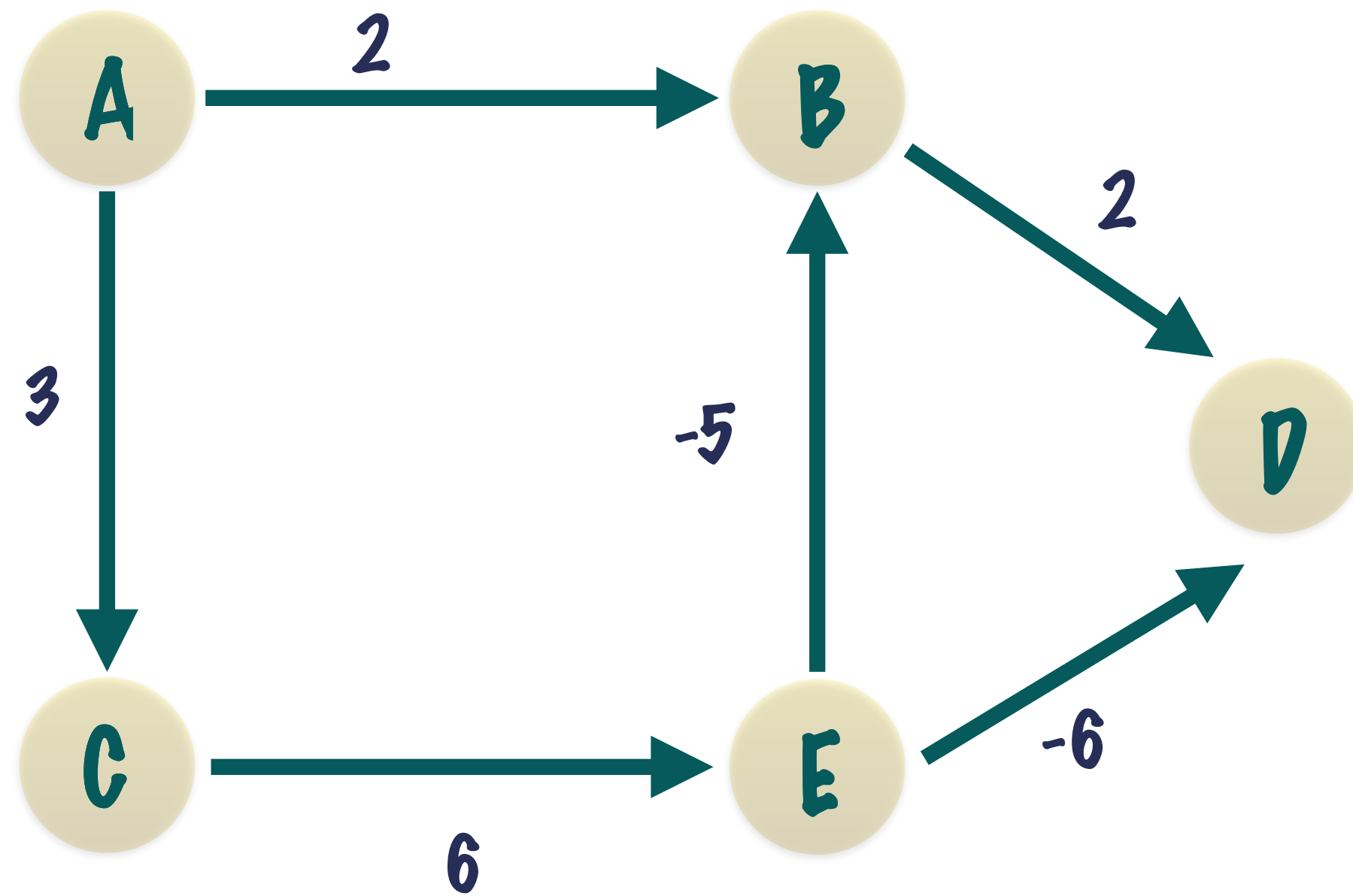
FINDING THE SHORTEST PATH IN GRAPHS WITH NEGATIVE WEIGHTS IS A DIFFERENT ALGORITHM

## THE BELLMAN-FORD ALGORITHM

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

### THE BELLMAN-FORD ALGORITHM



THE ALGORITHM IS  
COMBINATION OF  
DIJKSTRA'S AND  
SHORTEST UNWEIGHTED  
PATH ALGORITHM!

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

WE CONTINUE TO USE THE DISTANCE  
TABLE TO STORE INFORMATION

VERTEX	DISTANCE	LAST VERTEX
A	0	A
B	INF	
C	INF	
D	INF	
E	INF	

$\text{DISTANCE}[\text{NEIGHBOUR}] = \text{DISTANCE}[\text{VERTEX}] + \text{WEIGHT OF EDGE}[\text{VERTEX}, \text{NEIGHBOUR}]$

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

HOWEVER THIS ALGORITHM IS NOT "GREEDY"  
AND WE DO NOT NEED A PRIORITY QUEUE TO  
TRAVERSE NODES

GREEDY ALGORITHMS WORK WELL WHEN ALL  
EDGES ARE POSITIVE ALLOWING YOU TO CHOOSE  
THE MOST OPTIMAL STEP AND EVERY VERTEX

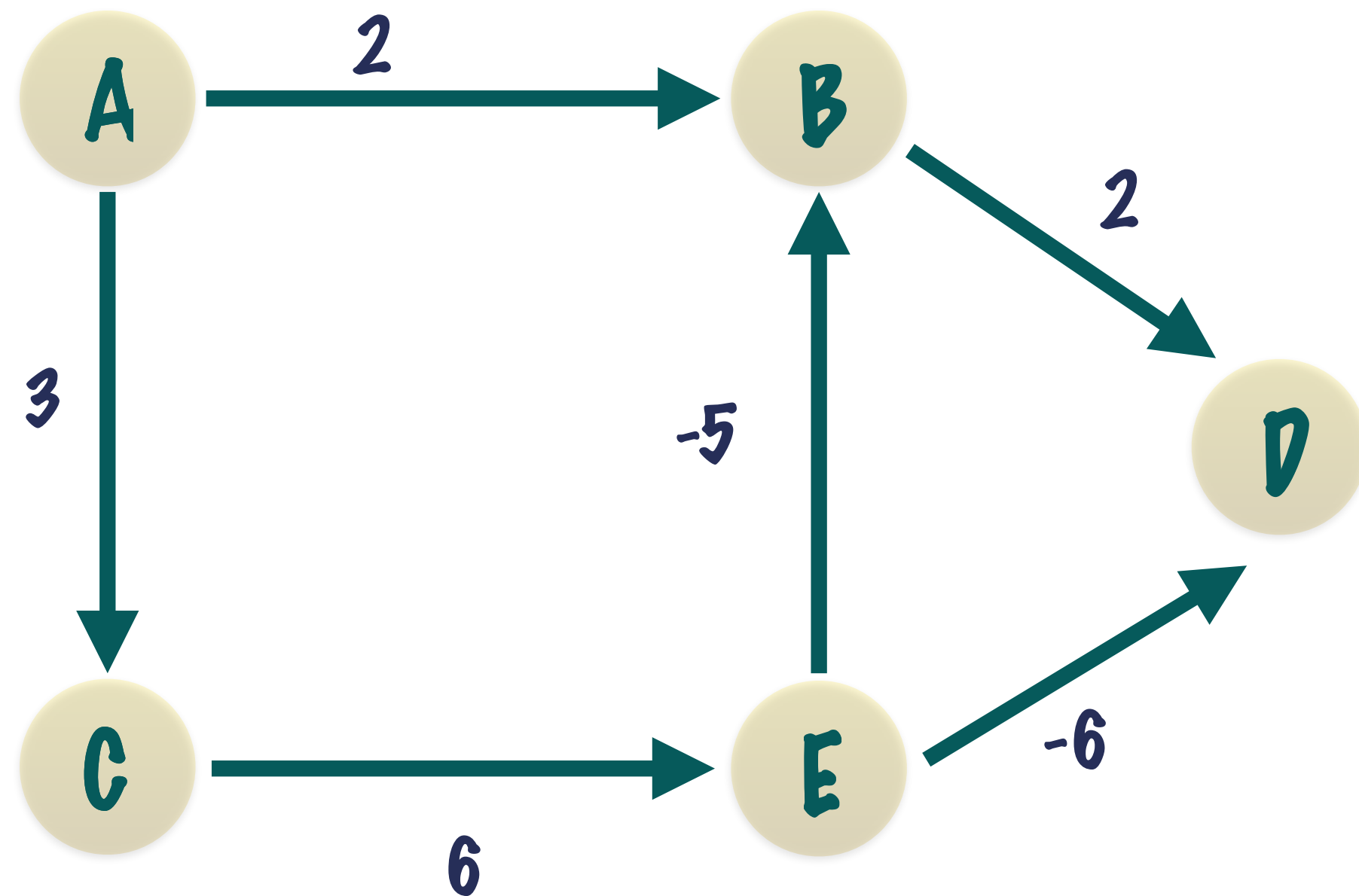
WITH NEGATIVE DISTANCES THE SUM OF  
DISTANCES ARE NOT MONOTONICALLY  
INCREASING - A SINGLE NEGATIVE PATH CAN  
CHANGE THE SOLUTION COMPLETELY!



# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

WITH NEGATIVE DISTANCES THE SUM OF DISTANCES ARE **NOT MONOTONICALLY INCREASING** - A SINGLE NEGATIVE PATH CAN CHANGE THE SOLUTION COMPLETELY!

WITH NEGATIVE WEIGHTS IT'S POSSIBLE THAT A PATH WHICH SEEMS **SUB-OPTIMAL CURRENTLY** LEADS TO A NEGATIVE EDGE WHICH MAKES IT THE BEST PATH!

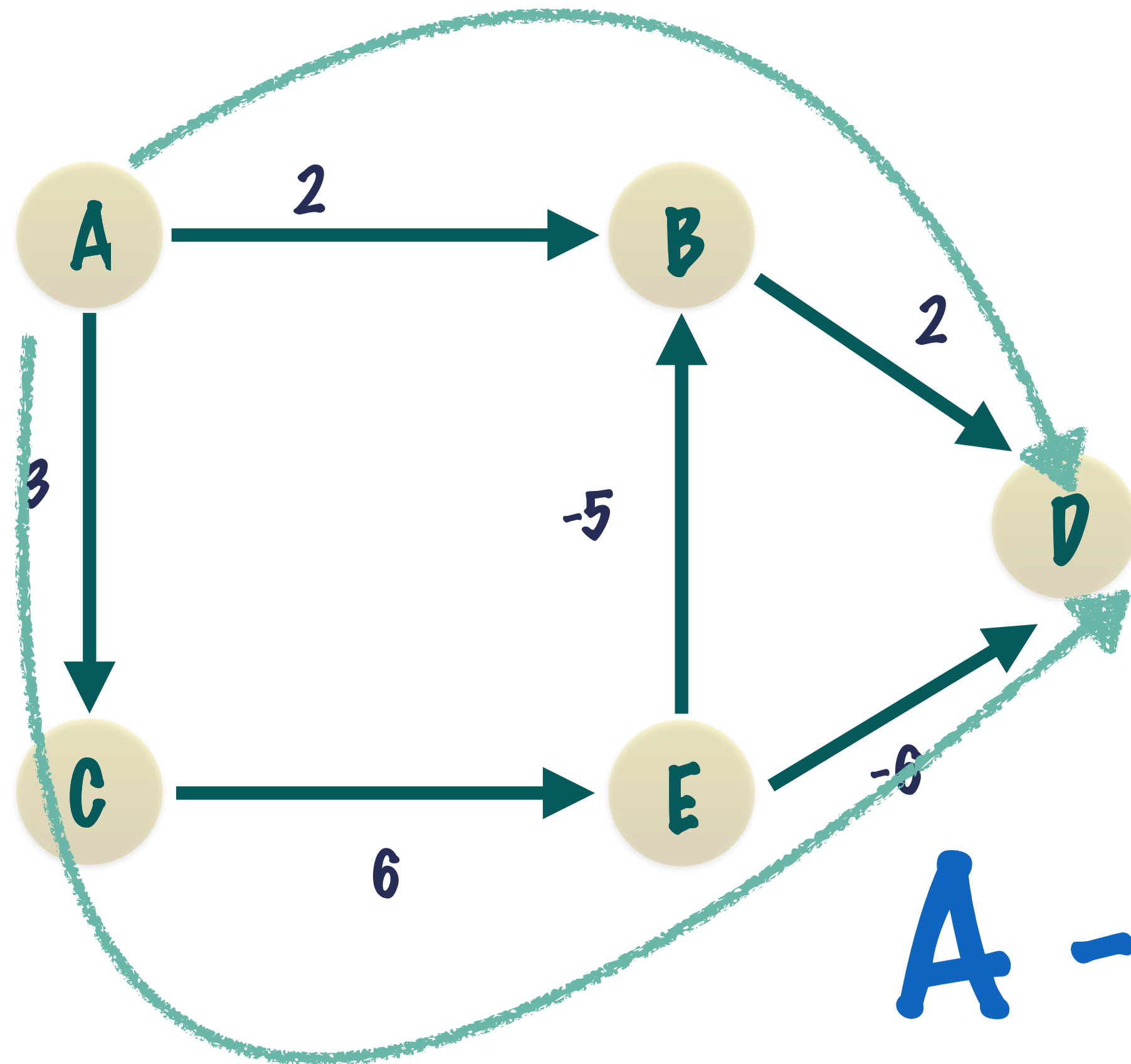


LET'S TAKE AN EXAMPLE

**A → D**

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



LET'S TAKE AN EXAMPLE

$A \rightarrow D$

TWO PATHS

DISTANCE

$A \rightarrow B \rightarrow D$

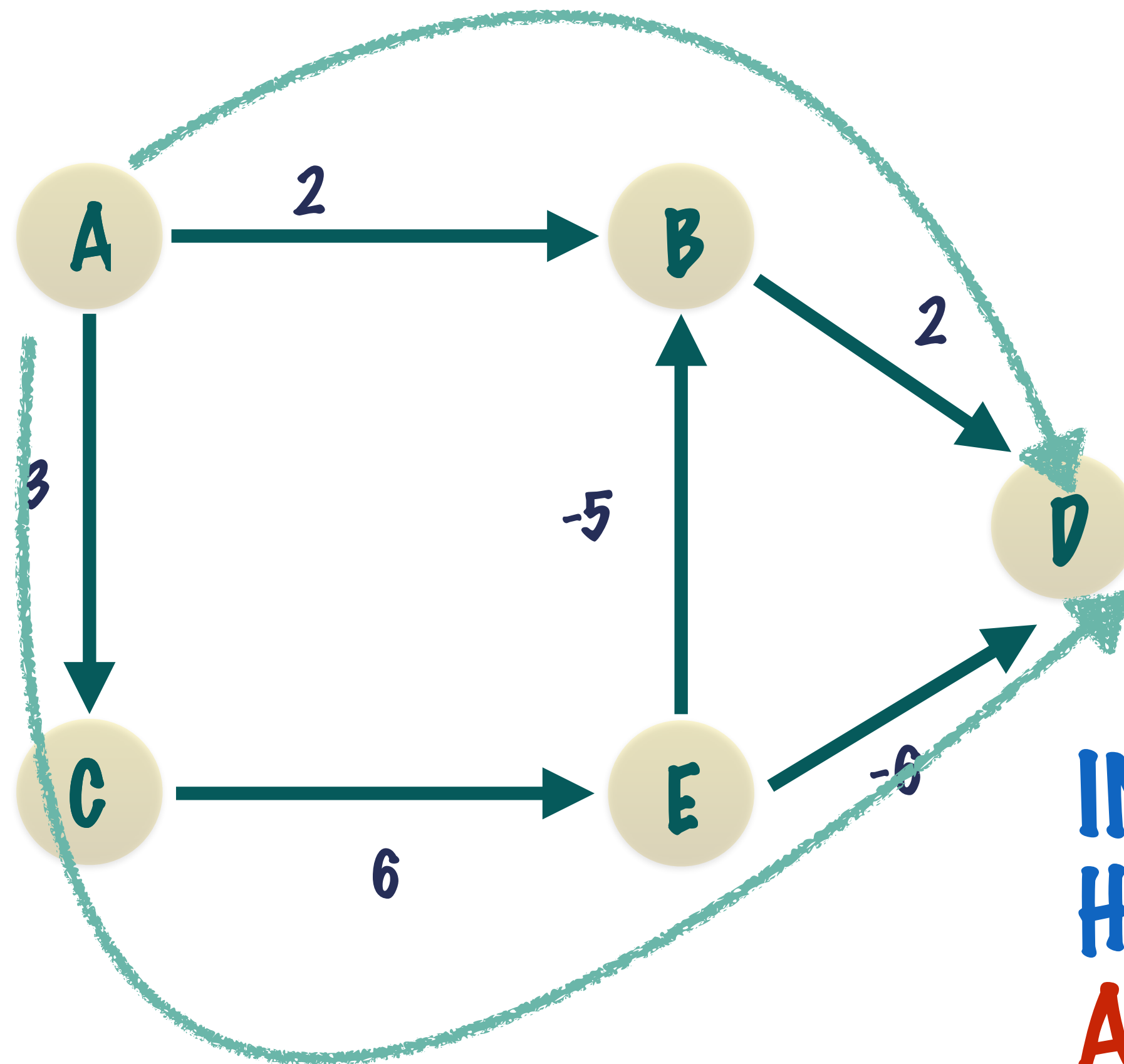
4

$A \rightarrow C \rightarrow E \rightarrow D$

3

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



A → B → D

A → C → E → D

DISTANCE

4

3

IN THE GREEDY ALGORITHM WE WOULD HAVE CHOSEN THE A → B → D PATH OVER THE A → C → E → D BUT THAT WOULD HAVE BEEN SUB-OPTIMAL AS LATER ON WE WOULD DISCOVER THE SMALLER WEIGHT PATH.



# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

DIJKSTRA'S ALGORITHM USES A PRIORITY QUEUE TO GREEDILY SELECT THE CLOSEST VERTEX AND VISITS ALL ITS ADJACENT EDGES - THE PROCESS CALLED RELAXATION

BY CONTRAST, THE BELLMAN-FORD ALGORITHM PROCESS ALL THE EDGES I.E. RELAXES ALL THE EDGES

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

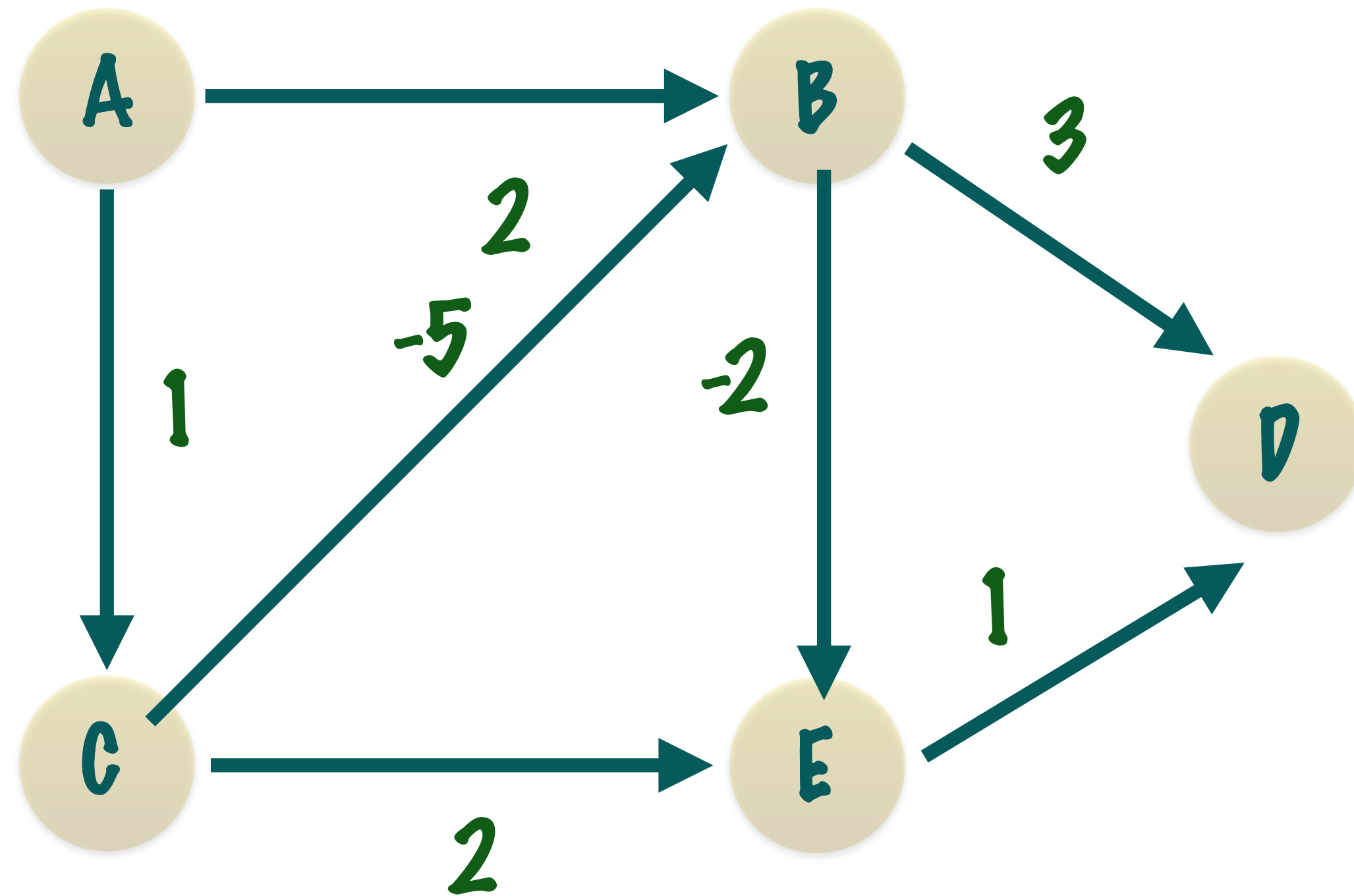
BY CONTRAST, THE BELLMAN-FORD  
ALGORITHM PROCESS ALL THE  
EDGES I.E. RELAXES ALL THE EDGES

$$\text{DISTANCE [NEIGHBOUR]} = \text{DISTANCE [CURRENT]} + \text{WEIGHT OF EDGE [CURRENT, NEIGHBOUR]}$$

WE DO THIS COMPUTATION  
FOR EVERY EDGE AND DO IT  
(V-1) TIMES FOR EACH EDGE!

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



WE'LL START FROM  
VERTEX A AT RANDOM

## INITIALIZE THE DISTANCE TABLE

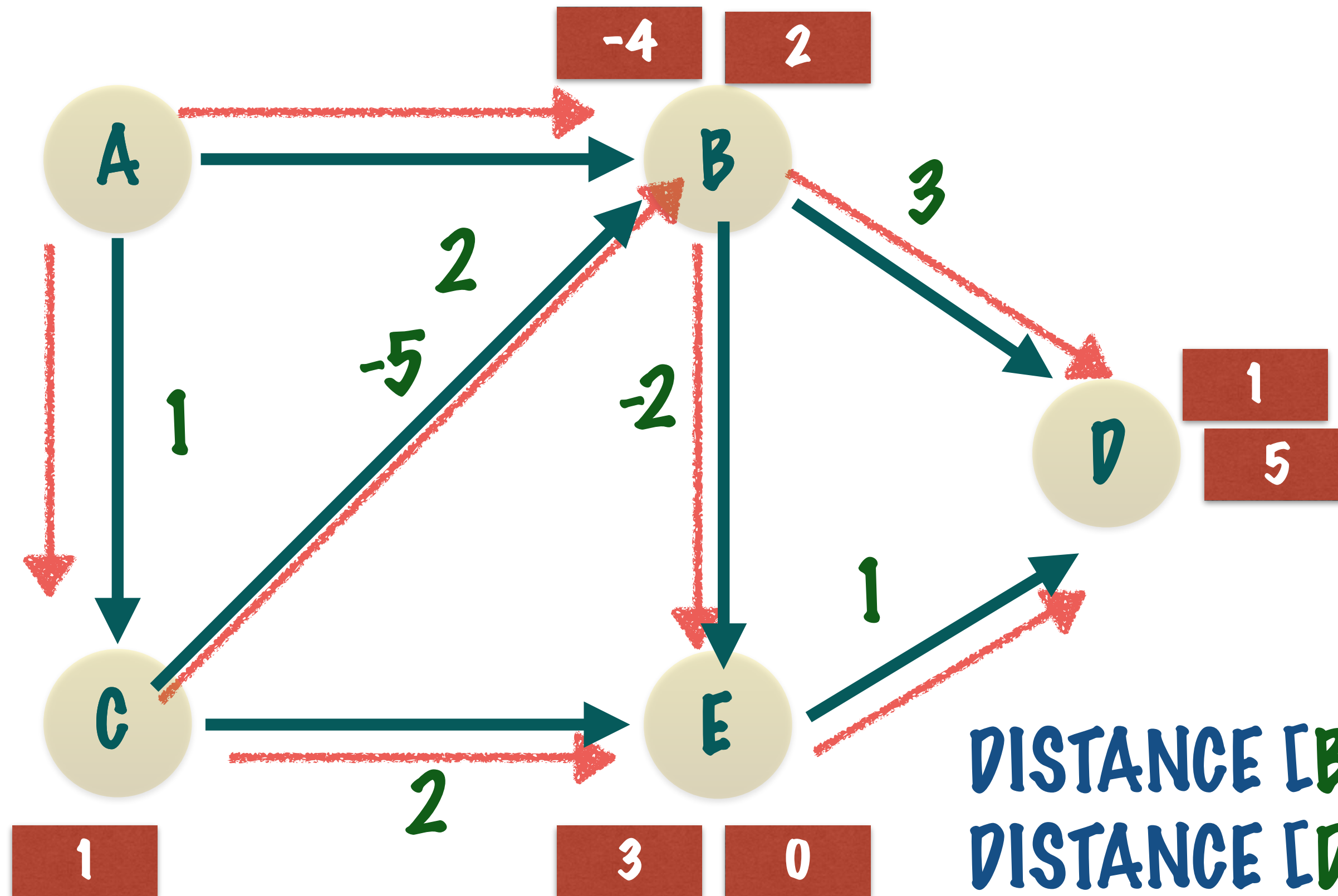
VERTEX	DISTANCE	LAST VERTEX
A	0	A
B	INF	
C	INF	
D	INF	
E	INF	

SINCE THIS ALGORITHM COVERS  
ALL THE EDGES **V-1** TIMES, WE  
CAN START WITH ANY VERTEX,  
AND THE RESULT WILL BE THE  
SAME

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

### THE FIRST ITERATION



DISTANCE [B] = DISTANCE [A] + WEIGHT OF EDGE [A, B]

DISTANCE [D] = DISTANCE [B] + WEIGHT OF EDGE [B, D]

DISTANCE [E] = DISTANCE [B] + WEIGHT OF EDGE [B, E]

DISTANCE [D] = DISTANCE [E] + WEIGHT OF EDGE [E, D]

DISTANCE [C] = DISTANCE [A] + WEIGHT OF EDGE [A, C]

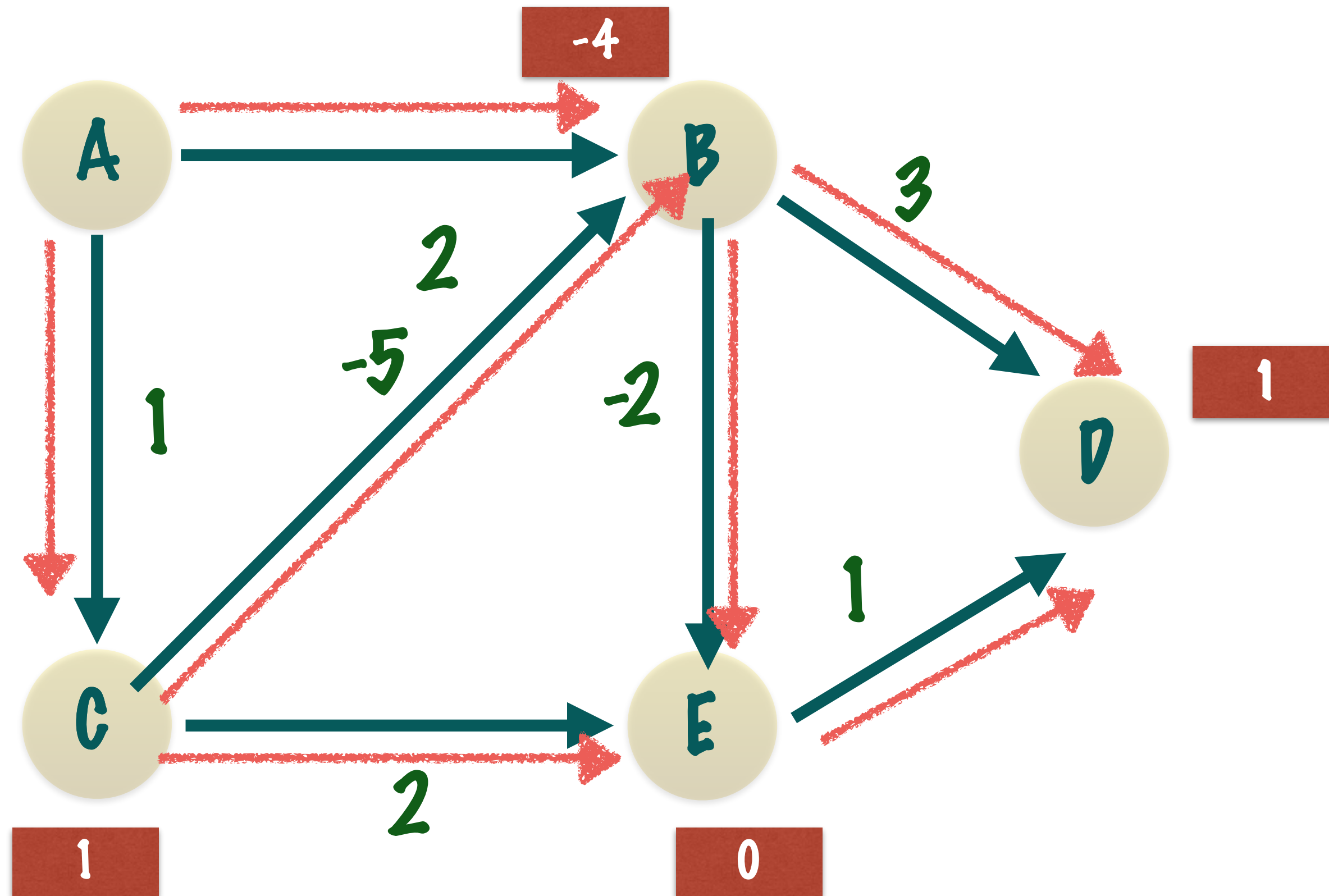
DISTANCE [E] = DISTANCE [C] + WEIGHT OF EDGE [C, E]

DISTANCE [D] = DISTANCE [C] + WEIGHT OF EDGE [C, D]



# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



## THE FIRST ITERATION

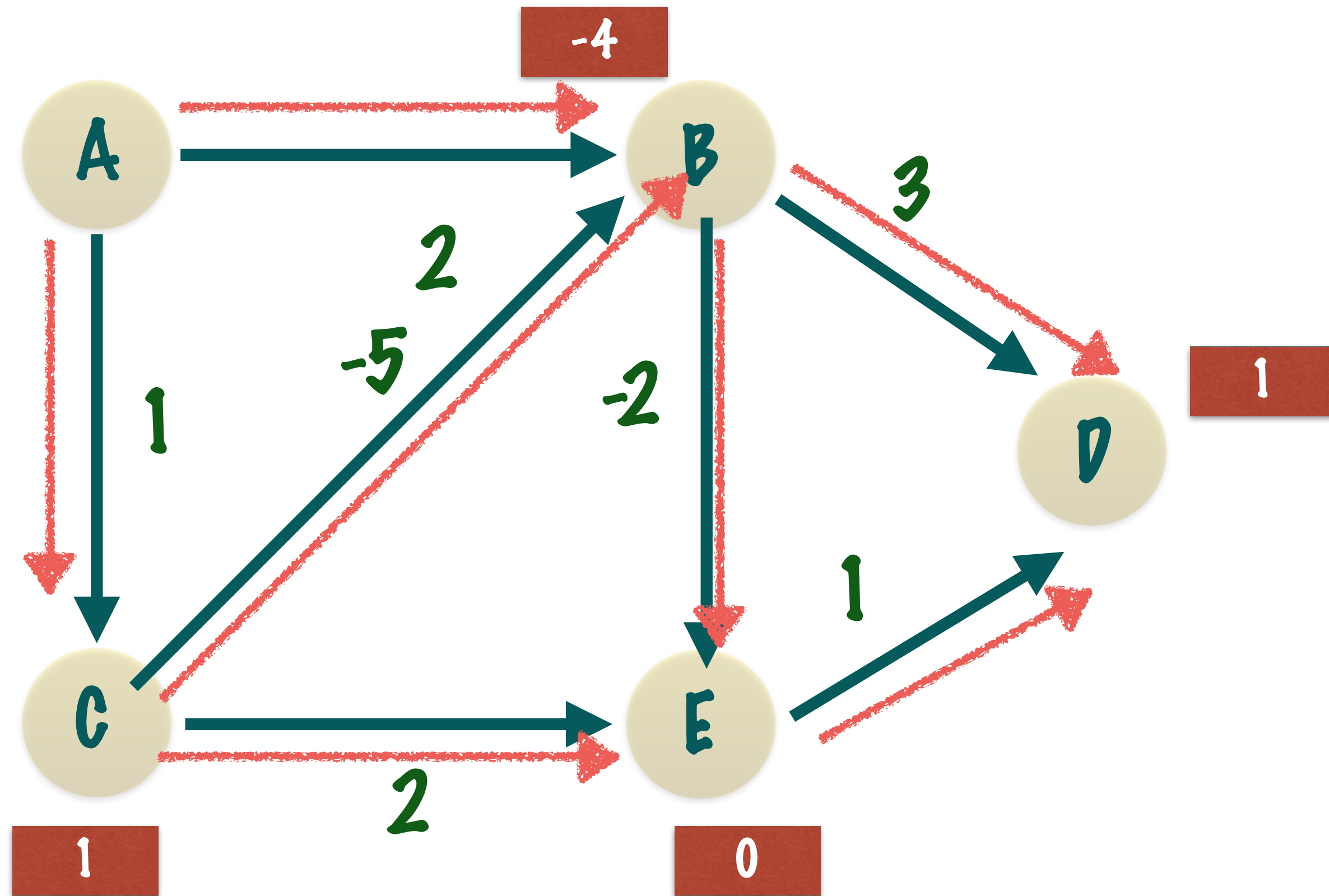
DISTANCE [B] = DISTANCE [A] + WEIGHT OF EDGE [A, B]  
DISTANCE [D] = DISTANCE [B] + WEIGHT OF EDGE [B, D]  
DISTANCE [E] = DISTANCE [B] + WEIGHT OF EDGE [B, E]  
DISTANCE [D] = DISTANCE [E] + WEIGHT OF EDGE [E, D]  
DISTANCE [C] = DISTANCE [A] + WEIGHT OF EDGE [A, C]  
DISTANCE [E] = DISTANCE [C] + WEIGHT OF EDGE [C, E]  
DISTANCE [D] = DISTANCE [C] + WEIGHT OF EDGE [C, D]

VERTEX	DISTANCE	LAST VERTEX
A	0	A
B	-4	C
C	1	B
D	1	E
E	0	B



# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

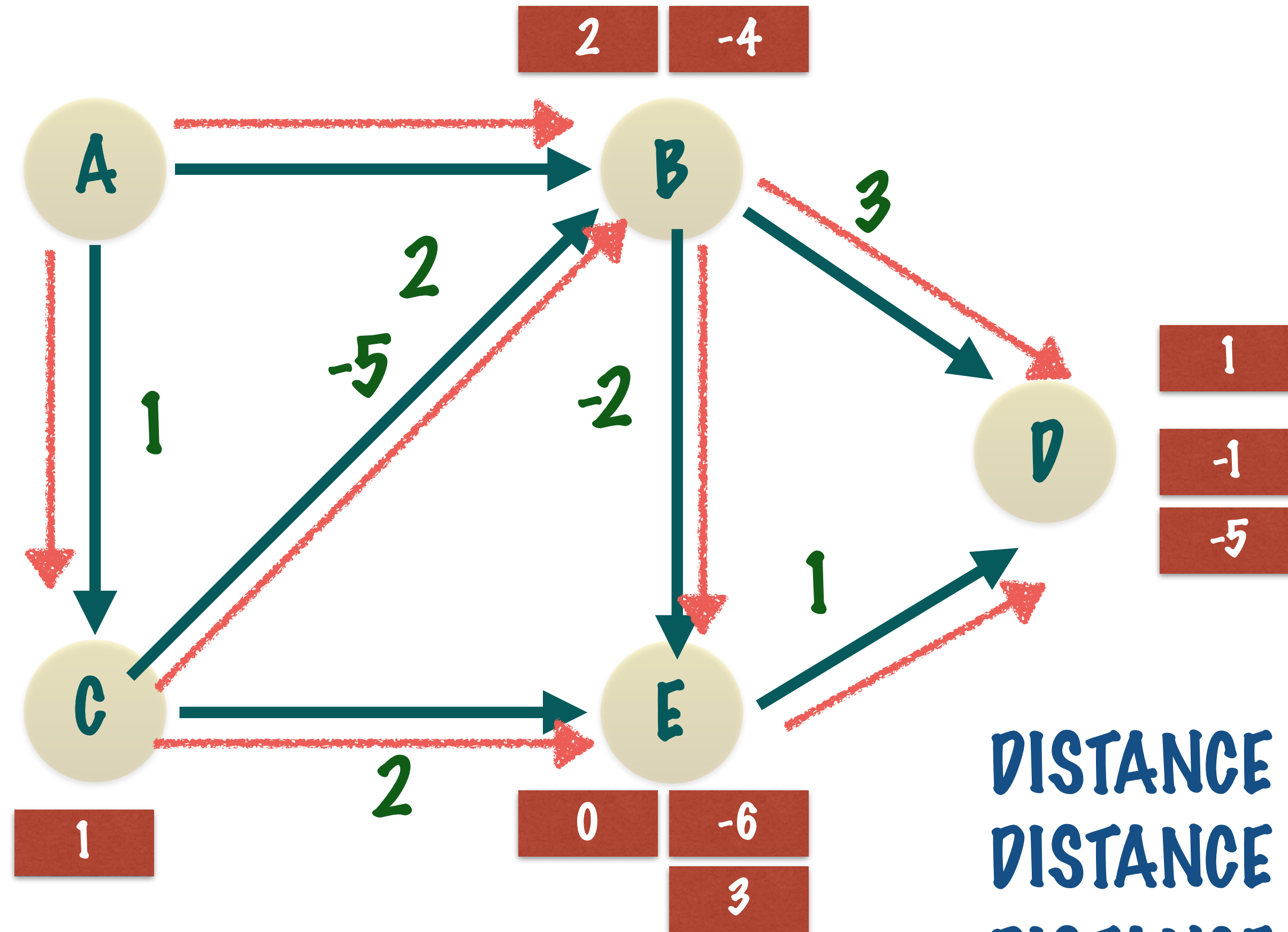


VERTEX	DISTANCE	LAST VERTEX
A	0	A
B	-4	C
C	1	B
D	1	E
E	0	B

AFTER THE 1ST ITERATION ONLY B AND C'S DISTANCES ARE ACCURATE WHICH ARE AT 1 EDGE DISTANCE FROM SOURCE!

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

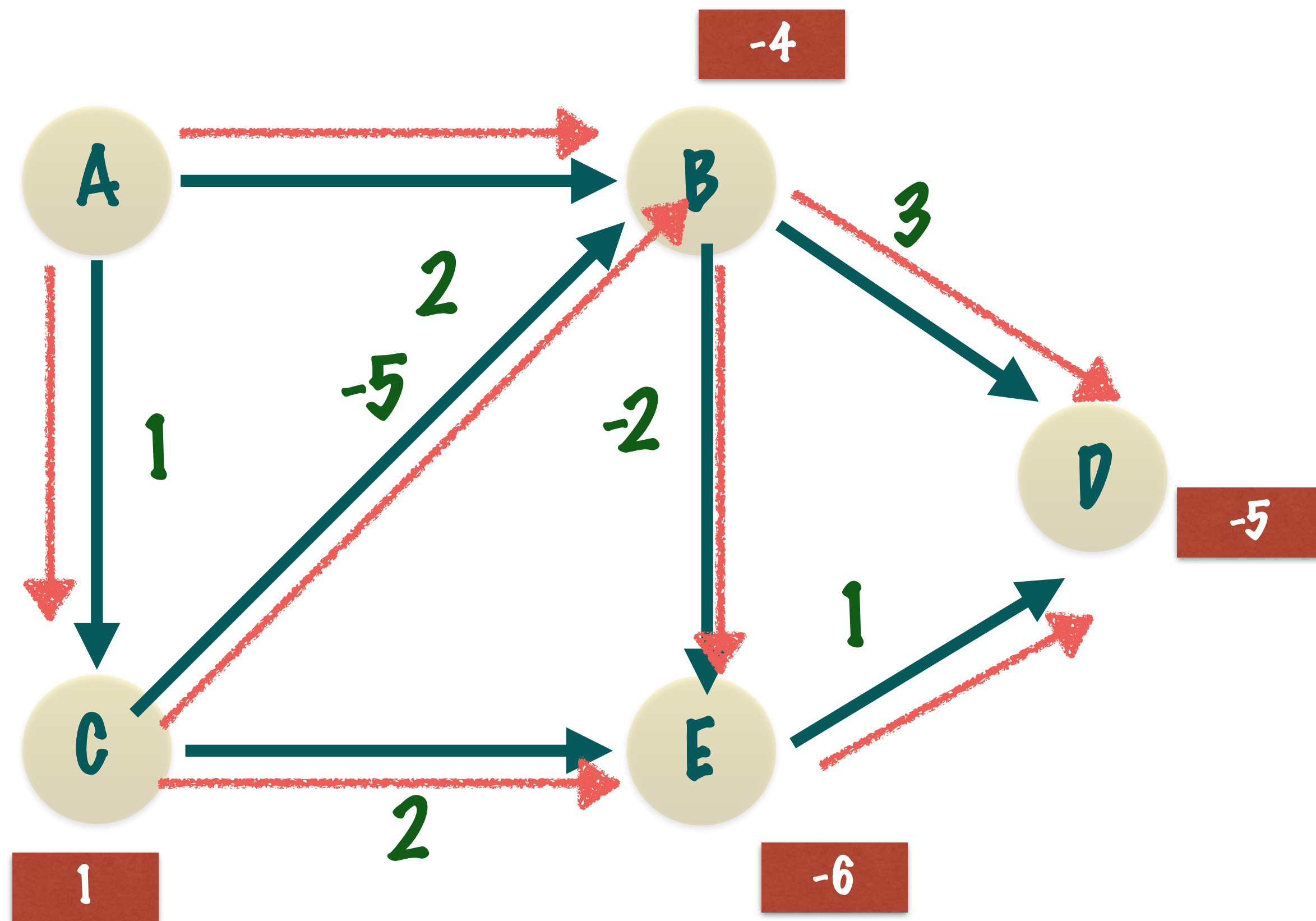


## THE SECOND ITERATION

DISTANCE [B] = DISTANCE [A] + WEIGHT OF EDGE [A, B]  
DISTANCE [D] = DISTANCE [B] + WEIGHT OF EDGE [B, D]  
DISTANCE [E] = DISTANCE [B] + WEIGHT OF EDGE [B, E]  
DISTANCE [D] = DISTANCE [E] + WEIGHT OF EDGE [E, D]  
DISTANCE [C] = DISTANCE [A] + WEIGHT OF EDGE [A, C]  
DISTANCE [E] = DISTANCE [C] + WEIGHT OF EDGE [C, E]  
DISTANCE [B] = DISTANCE [C] + WEIGHT OF EDGE [C, B]

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



## THE SECOND ITERATION

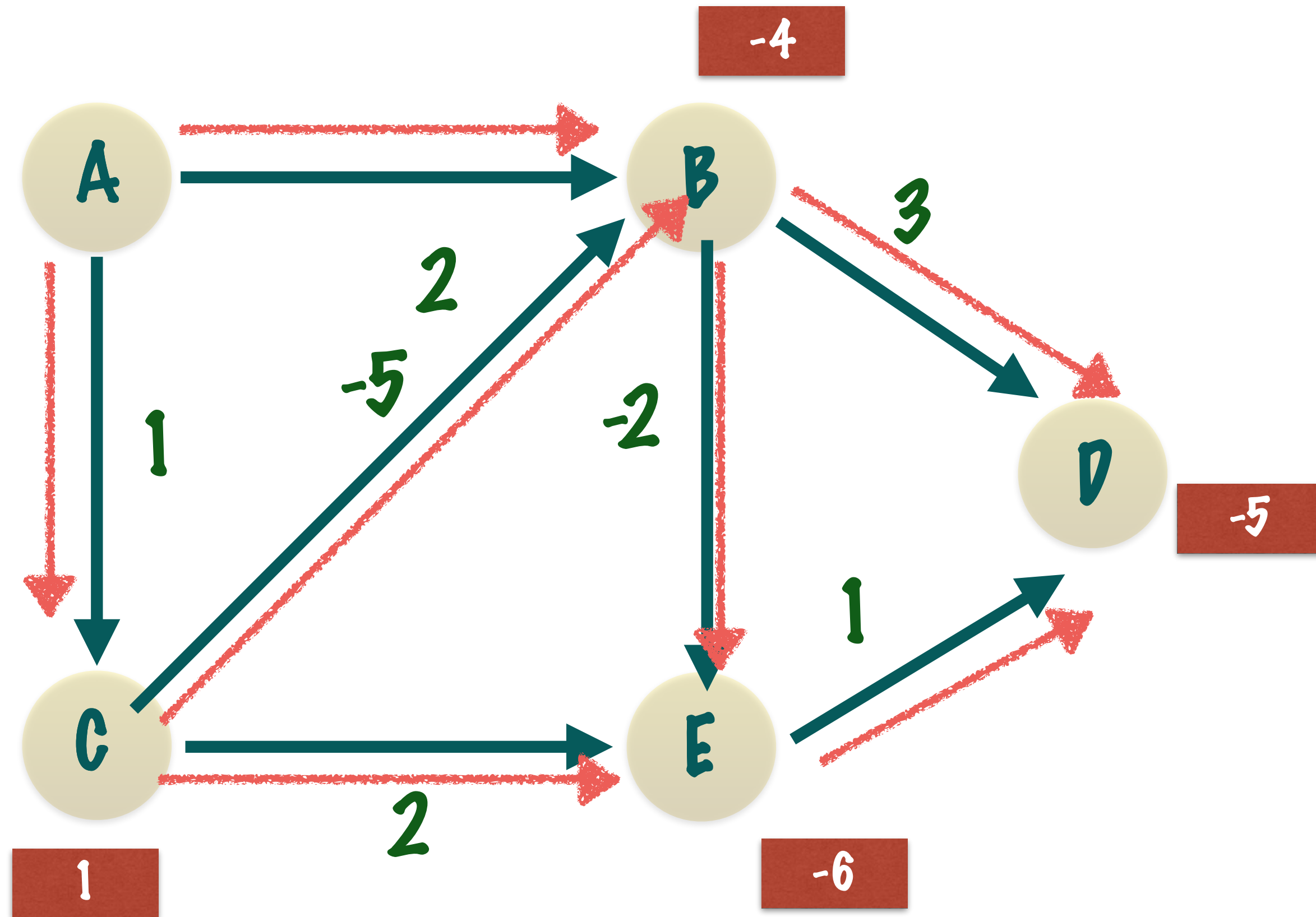
DISTANCE [B] = DISTANCE [A] + WEIGHT OF EDGE [A, B]  
DISTANCE [D] = DISTANCE [B] + WEIGHT OF EDGE [B, D]  
DISTANCE [E] = DISTANCE [B] + WEIGHT OF EDGE [B, E]  
DISTANCE [D] = DISTANCE [E] + WEIGHT OF EDGE [E, D]  
DISTANCE [C] = DISTANCE [A] + WEIGHT OF EDGE [A, C]  
DISTANCE [E] = DISTANCE [C] + WEIGHT OF EDGE [C, E]  
DISTANCE [B] = DISTANCE [C] + WEIGHT OF EDGE [C, B]

VERTEX	DISTANCE	LAST VERTEX
A	0	A
B	-4	C
C	1	B
D	-5	B
E	-6	B



# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH



VERTEX	DISTANCE	LAST VERTEX
A	0	A
B	-4	C
C	1	B
D	-5	B
E	-6	B

AFTER THIS ITERATION ALL DISTANCES ARE ACCURATE!

IT JUST SO HAPPENED THAT WE GOT ACCURATE DISTANCES FROM SOURCE A WITH 2 ITERATIONS

TO GUARANTEE THAT WE FIND THE SHORTEST PATH WE NEED  $V - 1$  ITERATIONS

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

TO GUARANTEE THAT WE FIND THE  
SHORTEST PATH WE NEED  $V - 1$   
ITERATIONS

WHY?

THE LONGEST POSSIBLE PATH IN A GRAPH HAS  $V - 1$  EDGES

AFTER 1 ITERATION ALL  
VERTICES WHICH ARE 1  
EDGE AWAY FROM THE  
SOURCE ARE ACCURATE

AFTER 2 ITERATIONS ALL  
VERTICES WHICH ARE 2  
EDGES AWAY FROM THE  
SOURCE ARE ACCURATE

AFTER 3 ITERATIONS ALL  
VERTICES WHICH ARE 3  
EDGES AWAY FROM THE  
SOURCE ARE ACCURATE



# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

TO GUARANTEE THAT WE FIND THE  
SHORTEST PATH WE NEED  $V - 1$   
ITERATIONS

WHY?

THE LONGEST POSSIBLE PATH IN A GRAPH HAS  $V - 1$  EDGES

AFTER 1 ITERATION ALL  
VERTICES WHICH ARE 1  
EDGE AWAY FROM THE  
SOURCE ARE ACCURATE

AFTER 2 ITERATIONS ALL  
VERTICES WHICH ARE 2  
EDGES AWAY FROM THE  
SOURCE ARE ACCURATE

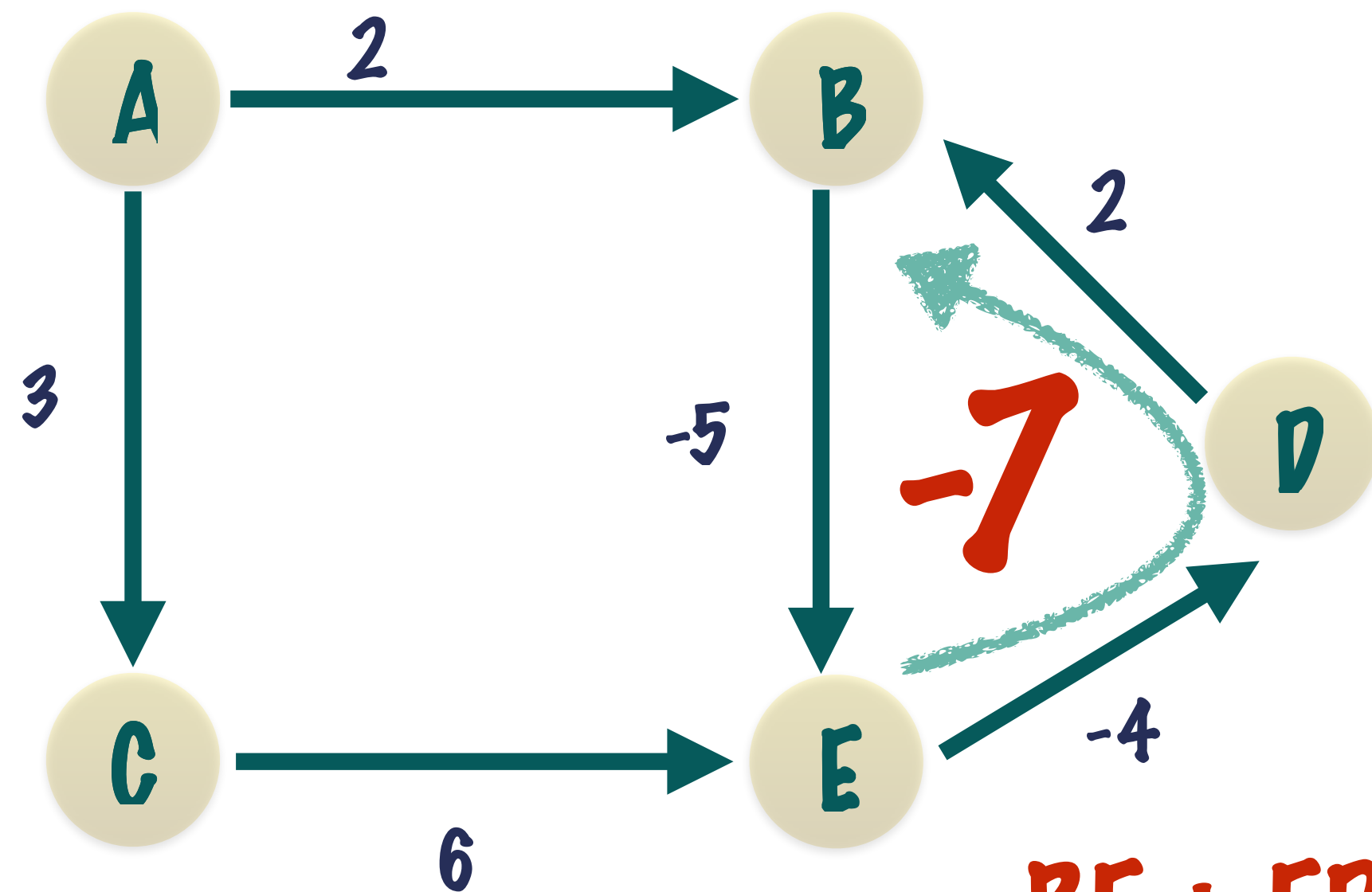
AFTER 3 ITERATIONS ALL  
VERTICES WHICH ARE 3  
EDGES AWAY FROM THE  
SOURCE ARE ACCURATE

WITH  $V - 1$  ITERATIONS WE CAN  
GUARANTEE THAT THE VERTEX FURTHEST  
AWAY FROM THE SOURCE WILL ITS  
DISTANCE ACCURATELY CALCULATED

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

BUT THERE IS ONE THING THAT WE NEED TO TAKE  
CARE OF - **NEGATIVE CYCLES**

CONSIDER B, E, D



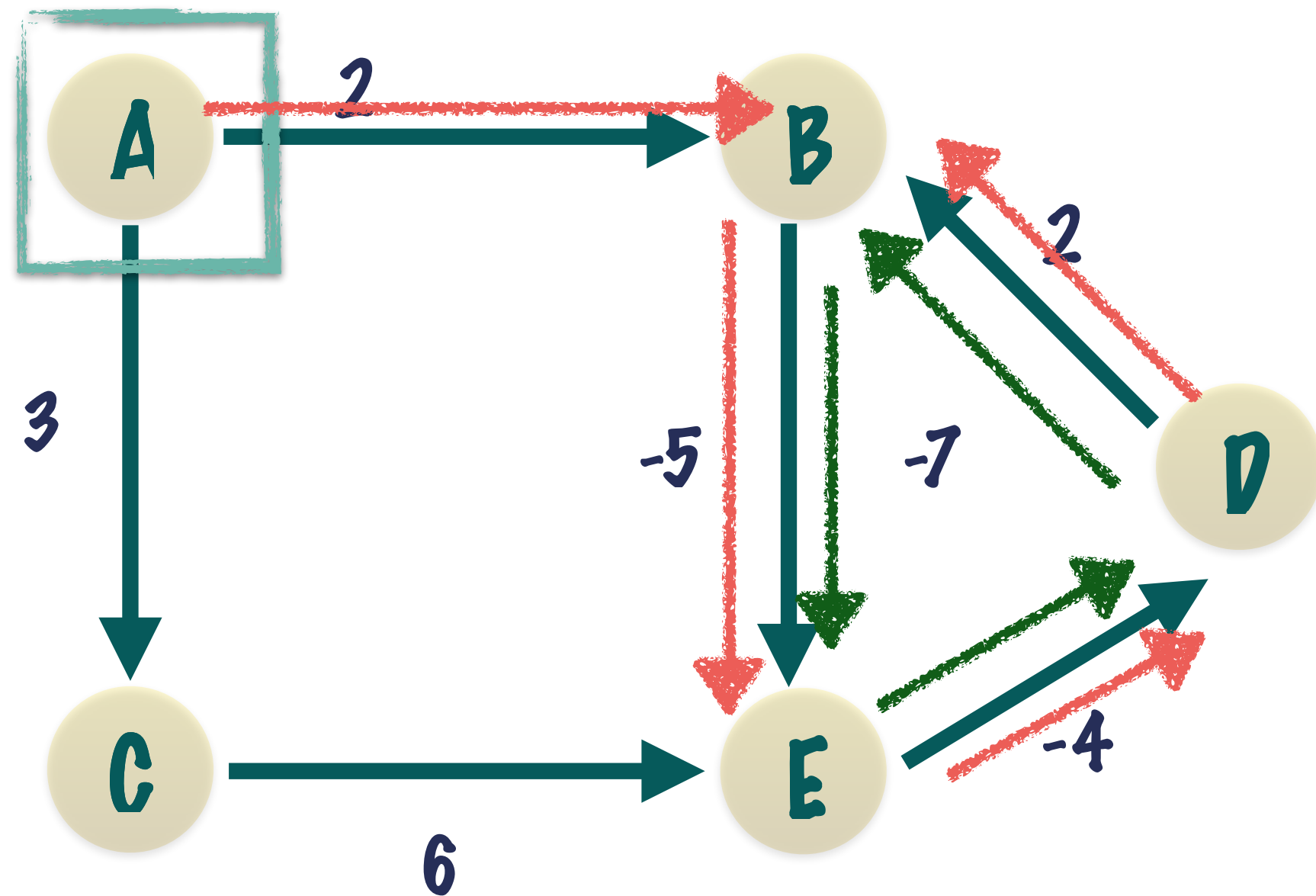
B -> E THEN FROM E -> D AND  
FINALLY BACK TO D -> B

$$BE + ED + DB = (-5) + (-4) + (2) = -7$$

**THE PATH IS A CYCLE WITH  
A NEGATIVE DISTANCE!**

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

IF A IS THE SOURCE VERTEX AND WE HAVE TO FIND THE **MINIMUM** PATH TO B



DIRECT PATH FROM A TO B

**DISTANCE = 2**

ONE ROUND OF THE CYCLE

**DISTANCE =  $2 - 7 = -5$**

SECOND ROUND OF CYCLE

**DISTANCE =  $-5 - 7 = -12$**

**A → B → E → D → B → E → D → B**

# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

DIRECT PATH FROM A TO B

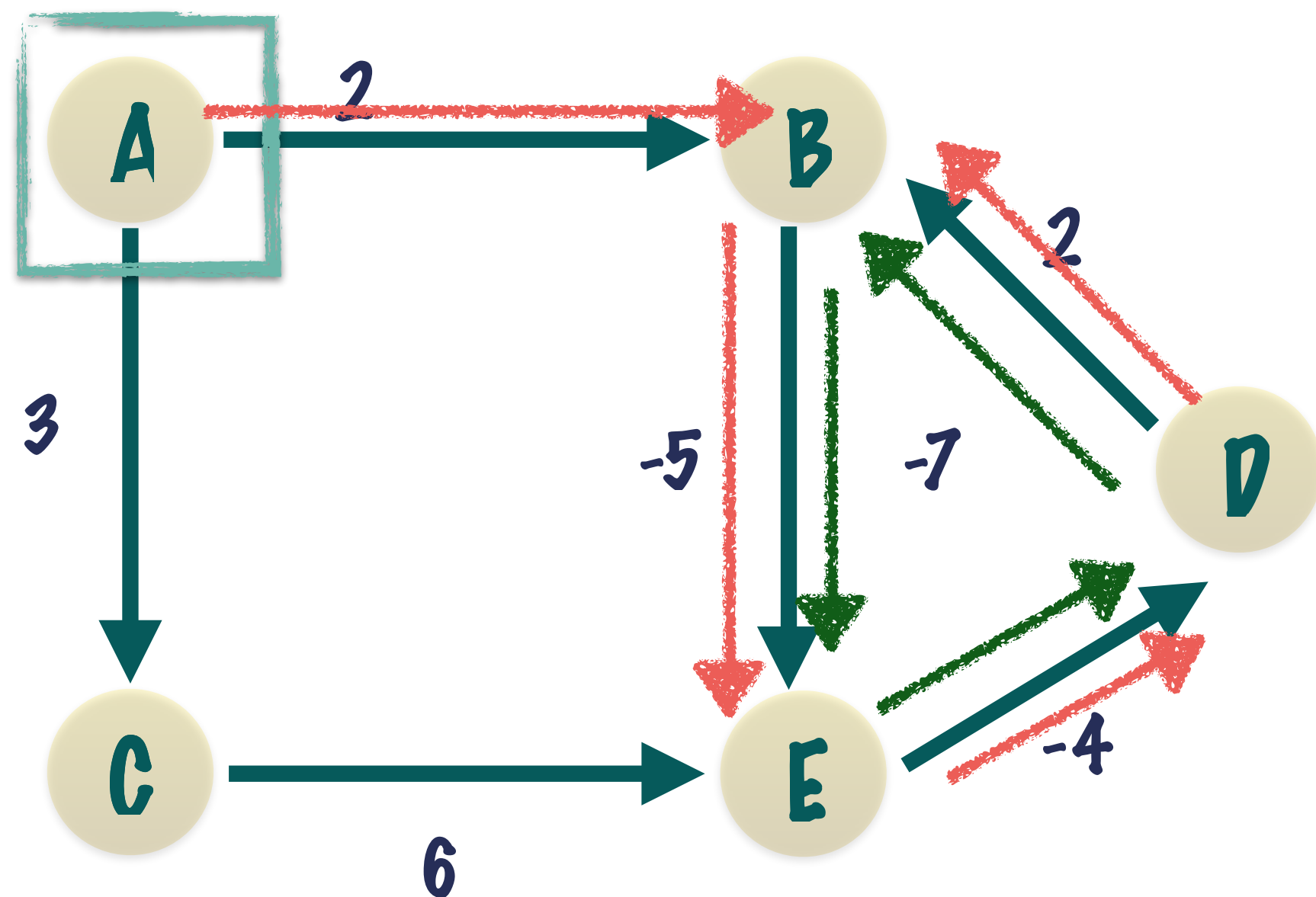
DISTANCE = 2

ONE ROUND OF THE CYCLE

DISTANCE =  $2 - 7 = -5$

SECOND ROUND OF CYCLE

DISTANCE =  $-5 - 7 = -12$



$A \rightarrow B \rightarrow E \rightarrow D \rightarrow B \rightarrow E \rightarrow D \rightarrow B$

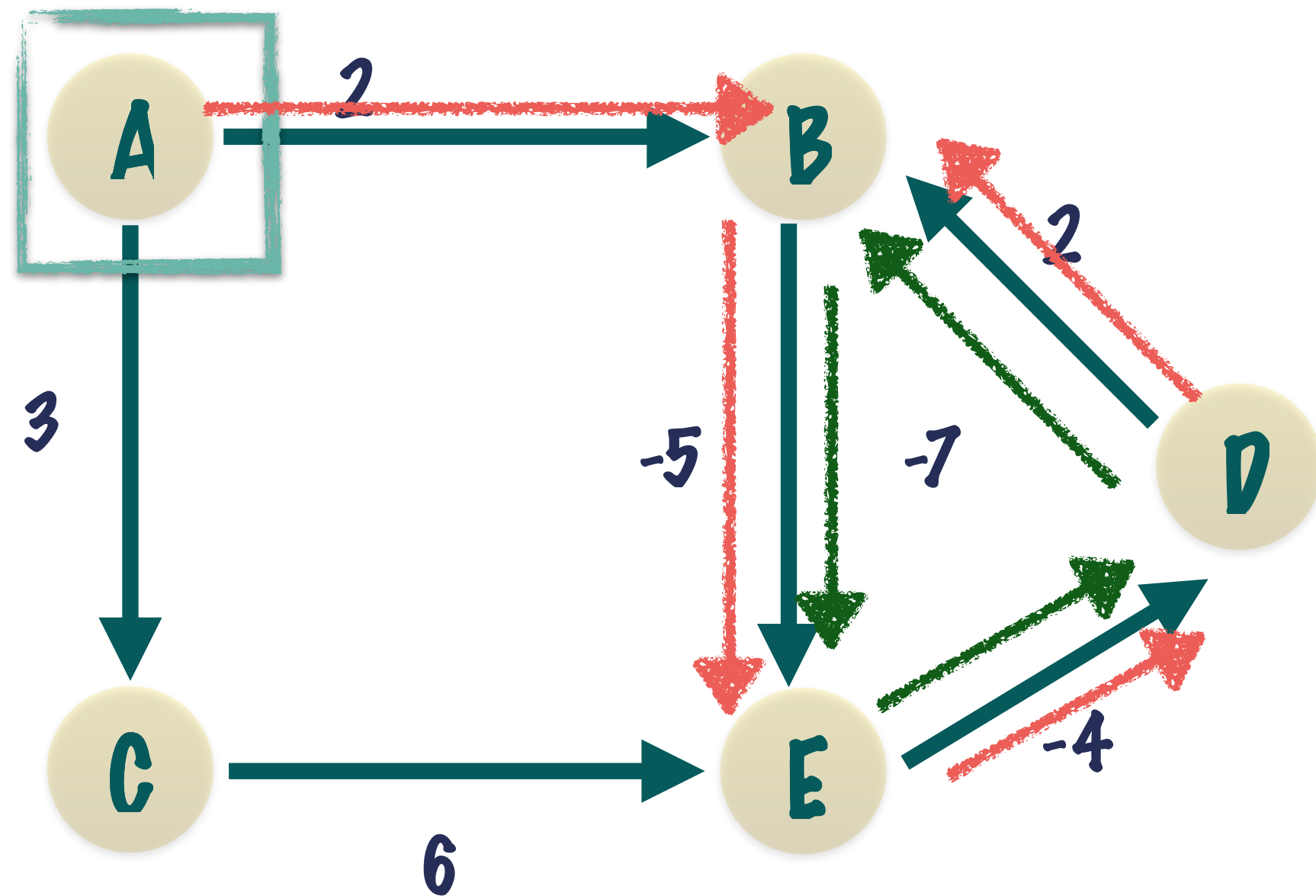
THERE IS NO SHORTEST OR CHEAPEST PATH!  
EVERY TIME WE GO AROUND WE WILL FIND  
SOMETHING SHORTER AND CHEAPER



# THE GRAPH

## SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

THERE IS NO SHORTEST OR CHEAPEST PATH!  
EVERY TIME WE GO AROUND WE WILL FIND  
SOMETHING SHORTER AND CHEAPER



SO HOW DO WE DETECT A CYCLE?

AFTER  $(V-1)$  ITERATION, WE WILL DO  
ONE MORE ITERATION (RELAXATION)

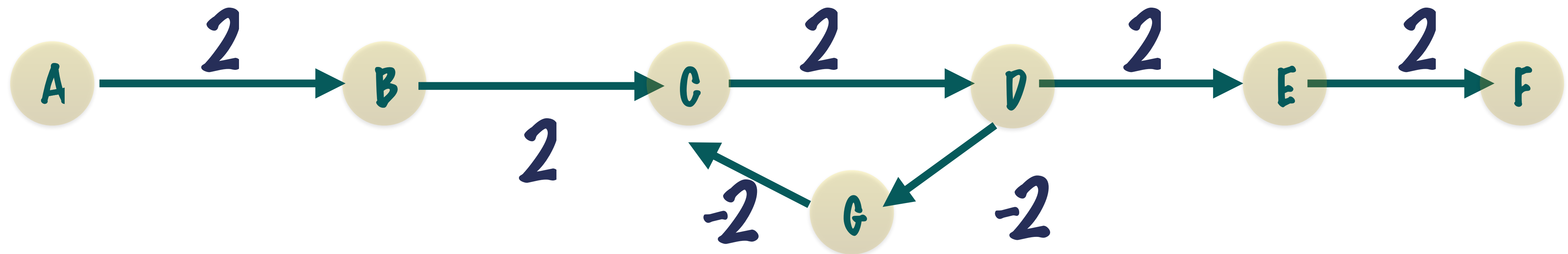
IF DISTANCE OF ANY VERTEX STILL GETS  
UPDATED, THEN THERE IS DEFINITELY A CYCLE!



# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

IF DISTANCE OF ANY VERTEX STILL GETS  
UPDATED, THEN THERE IS DEFINITELY A CYCLE!

NOTE: IF NO NEGATIVE CYCLES EXIST THEN THE  
LONGEST PATH BETWEEN TWO VERTICES IS AT  
MOST  $V - 1$  EDGES



THE PRESENCE OF A NEGATIVE CYCLE CAN MAKE A  
PATH BETWEEN TWO VERTICES **LONGER THAN THE  
LONGEST POSSIBLE PATH** IN A GRAPH I.E GREATER  
THAN  $V - 1$

# THE GRAPH SHORTEST PATH IN NEGATIVE WEIGHTED GRAPH

IN THE WORST CASE WE TRAVERSE  
ALL EDGES  $V - 1$  TIMES

RUNNING TIME IS :  $O(E*V)$   
[IF ADJACENCY LISTS ARE USED]

RUNNING TIME IS :  $O(V^3)$  [IF  
ADJACENCY MATRIX ARE USED]

$E = V*V$  IN ADJACENCY MATRIX

# DISTANCE TABLE DATA STRUCTURE

```
/**
 * A class which holds the distance information of any vertex.
 * The distance specified is the distance from the source node
 * and the last vertex is the last vertex just before the current
 * one while traversing from the source node.
 */
public static class DistanceInfo {

    private int distance;
    private int lastVertex;

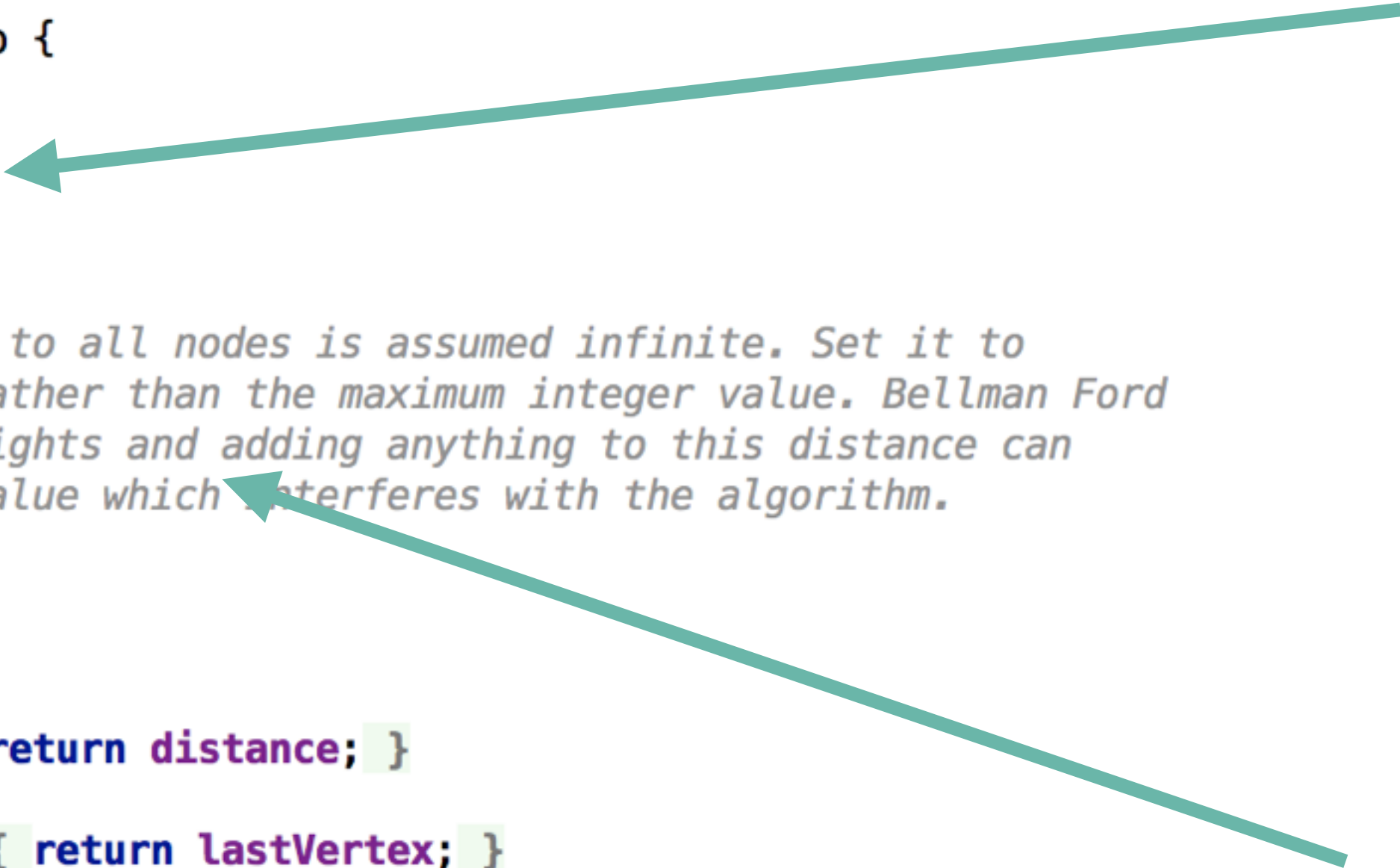
    public DistanceInfo() {
        // The initial distance to all nodes is assumed infinite. Set it to
        // a very large value rather than the maximum integer value. Bellman Ford
        // supports negative weights and adding anything to this distance can
        // make it a negative value which interferes with the algorithm.
        distance = 100000;
        lastVertex = -1 ;
    }

    public int getDistance() { return distance; }

    public int getLastVertex() { return lastVertex; }

    public void setDistance(int distance) {
        this.distance = distance;
    }

    public void setLastVertex(int lastVertex) {
        this.lastVertex = lastVertex;
    }
}
```



FOR EVERY VERTEX STORE

1. THE DISTANCE TO THE VERTEX FROM THE SOURCE
2. THE LAST VERTEX IN THE PATH FROM THE SOURCE

NOTE THAT WE SET THE INITIAL DISTANCE OF ALL THE NODES TO A LARGE VALUE RATHER THAN INTEGER.MAX

THIS IS BECAUSE ADDING TO INTEGER.MAX CAUSES THE INTEGER TO **OVERFLOW** AND BECOME A NEGATIVE VALUE - THIS **NEGATIVE VALUE CAN INTERFERE WITH THE ALGORITHM**



# BUILD THE DISTANCE TABLE - SETUP

```
public static Map<Integer, DistanceInfo> buildDistanceTable(Graph graph, int source) {  
    Map<Integer, DistanceInfo> distanceTable = new HashMap<>();  
    for (int j = 0; j < graph.getNumVertices(); j++) {  
        distanceTable.put(j, new DistanceInfo());  
    }  
  
    // Set up the distance of the specified source.  
    distanceTable.get(source).setDistance(0);  
    distanceTable.get(source).setLastVertex(source);  
  
    LinkedList<Integer> queue = new LinkedList<>();  
}
```

ADD A DISTANCE TABLE ENTRY  
FOR EACH NODE IN THE GRAPH



SET UP A SIMPLE QUEUE TO  
EXPLORE ALL THE VERTICES  
REGARDLESS OF PRIORITY



# BUILD THE DISTANCE TABLE - PROCESS

```
// Relaxing (processing) all the edges numVertices - 1 times
for (int numIterations = 0; numIterations < graph.getNumVertices() - 1; numIterations++) {
    // Add every vertex to the queue so we're sure to access all the edges
    // in the graph.
    for (int v = 0; v < graph.getNumVertices(); v++) {
        queue.add(v);
    }

    // Keep track of the edges visited so we visit each edge just once
    // in every iteration.
    Set<String> visitedEdges = new HashSet<>();
    while (!queue.isEmpty()) {
        int currentVertex = queue.pollFirst();

        for (int neighbor : graph.getAdjacentVertices(currentVertex)) {
            String edge = String.valueOf(currentVertex) + String.valueOf(neighbor);

            // Do not visit edges more than once in each iteration.
            if (visitedEdges.contains(edge)) {
                continue;
            }
            visitedEdges.add(edge);

            int distance = distanceTable.get(currentVertex).getDistance()
                + graph.getWeightedEdge(currentVertex, neighbor);
            // If we find a new shortest path to the neighbour update
            // the distance and the last vertex.
            if (distanceTable.get(neighbor).getDistance() > distance) {
                distanceTable.get(neighbor).setDistance(distance);
                distanceTable.get(neighbor).setLastVertex(currentVertex);
            }
        }
    }
}
```

ITERATE THROUGH ALL EDGES  
NUMBER OF VERTICES - 1 TIMES

ADD ALL VERTICES TO THE QUEUE  
SO WE CAN EXPLORE EVERY EDGE  
IN THIS GRAPH

KEEP TRACK OF VISITED EDGES SO  
WE DO NOT VISIT AN EDGE MORE  
THAN ONCE PER ITERATION

EDGE IS REPRESENTED AS A  
STRING "01" IS AN EDGE GOING  
FROM VERTEX 0 TO VERTEX 1

CHECK THE DISTANCES OF THE VERTICES  
AND UPDATE IF SHORTER ROUTES ARE  
FOUND



# BUILD THE DISTANCE TABLE - NEGATIVE CYCLES CHECK

```
// Add all the vertices to the queue one last time to check for
// a negative cycle.
for (int v = 0; v < graph.getNumVertices(); v++) {
    queue.add(v);
}

// Relaxing (processing) all the edges one last time to check if
// there exists a negative cycle
while (!queue.isEmpty()) {
    int currentVertex = queue.pollFirst();
    for (int neighbor : graph.getAdjacentVertices(currentVertex)) {
        int distance = distanceTable.get(currentVertex).getDistance()
            + graph.getWeightedEdge(currentVertex, neighbor);
        if (distanceTable.get(neighbor).getDistance() > distance) {
            throw new IllegalArgumentException("The Graph has a -ve cycle");
        }
    }
}

return distanceTable;
```

ADD ALL VERTICES ONCE AGAIN  
TO THE QUEUE TO CHECK ALL  
EDGES ONE LAST TIME FOR  
CYCLES

IF THE DISTANCE TABLE CAN BE  
UPDATED FOR ANY VERTEX AFTER  
NUMBER OF VERTICES - 1  
ITERATIONS IT MEANS THERE IS  
A NEGATIVE CYCLE IN THE GRAPH

THROW AN EXCEPTION IN THAT CASE,  
WE CAN'T FIND THE SHORTEST PATH IN A  
GRAPH WITH NEGATIVE CYCLES

# SHORTEST PATH

```
public static void shortestPath(Graph graph, Integer source, Integer destination) {  
    Map<Integer, DistanceInfo> distanceTable = buildDistanceTable(graph, source);  
  
    Stack<Integer> stack = new Stack<>();  
    stack.push(destination);  
  
    int previousVertex = distanceTable.get(destination).getLastVertex();  
    while (previousVertex != -1 && previousVertex != source) {  
        stack.push(previousVertex);  
        previousVertex = distanceTable.get(previousVertex).getLastVertex();  
    }  
  
    if (previousVertex == -1) {  
        System.out.println("There is no path from node: " + source  
            + " to node: " + destination);  
    }  
    else {  
        System.out.print("Smallest Path is " + source);  
        while (!stack.isEmpty()) {  
            System.out.print(" -> " + stack.pop());  
        }  
        System.out.println(" Dijkstra DONE!");  
    }  
}
```

BUILD THE DISTANCE TABLE  
FOR THE ENTIRE GRAPH

BACKTRACK USING A STACK,  
START FROM THE DESTINATION  
NODE

BACKTRACK BY GETTING THE  
LAST VERTEX OF EVERY NODE  
AND ADDING IT TO THE STACK

IF NO VALID LAST VERTEX WAS  
FOUND IN THE DISTANCE TABLE,  
THERE WAS NO PATH FROM  
SOURCE TO DESTINATION