



*Innovative Clinical Collaboration, Not Software*  
[www.3DnetMedical.com](http://www.3DnetMedical.com)

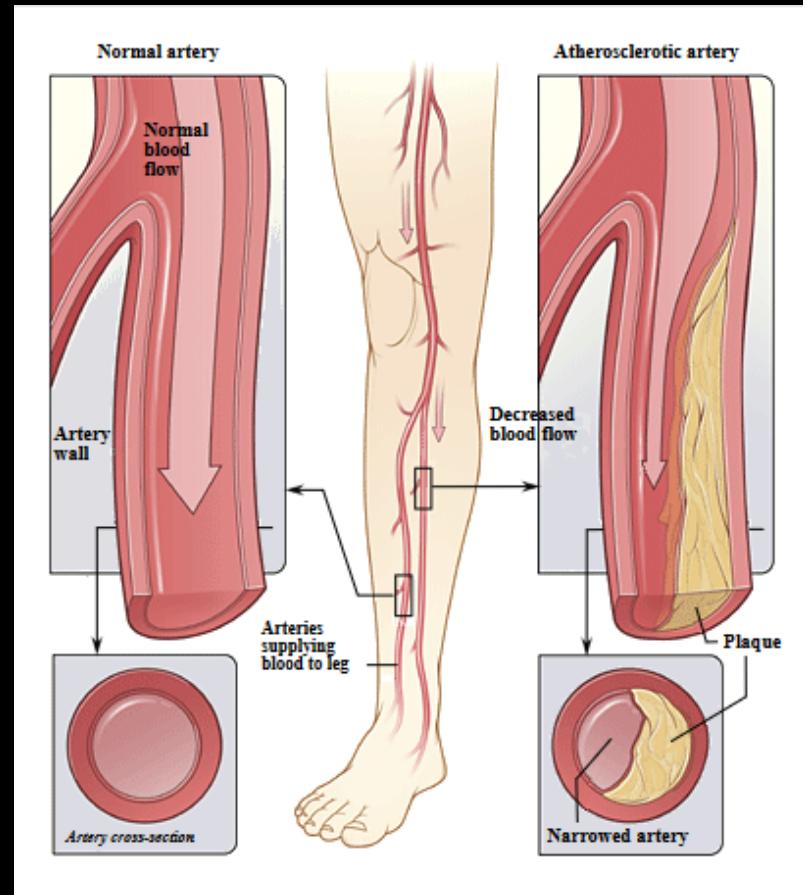
# Brief Overview of Vessel Module (Design and Implementation)

# Overview

- Use case
  - Efficient use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)
- Design of the Vessel Module
- Implementation
  - Vessel Centerline Extraction
- Testing and Reusability

# What is Peripheral Artery Disease (PAD)?

- Pain and severe cramping when walking or exercising in the calf muscles of the affected leg.
- Severe PAD complications include tissue death.
- Risk factors includes smoking, high blood sugar and high blood pressure.



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<https://commons.wikimedia.org/w/index.php?curid=31200275>

# Use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)

- CT angiography is a contrast CT where images are taken with a certain delay after injection of radiocontrast material (e.g. iodine)



Before injection

# Use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)

- CT angiography is a contrast CT where images are taken with a certain delay after injection of radiocontrast material (e.g. iodine)



After injection

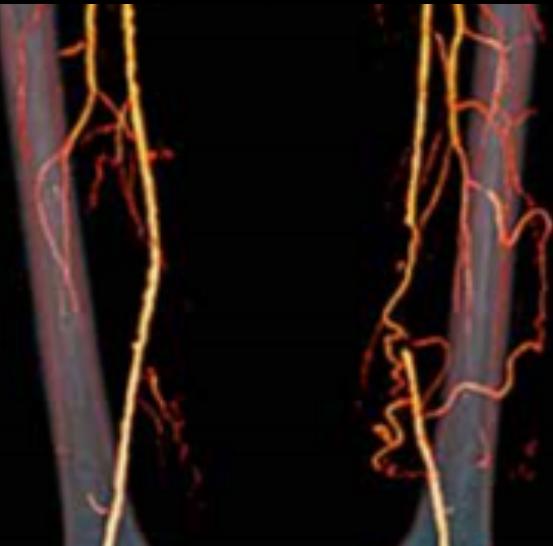
# Use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)

- A complete thrombotic occlusion in the left superficial femoral artery (SFA), with reformation in the adductor canal through collaterals.



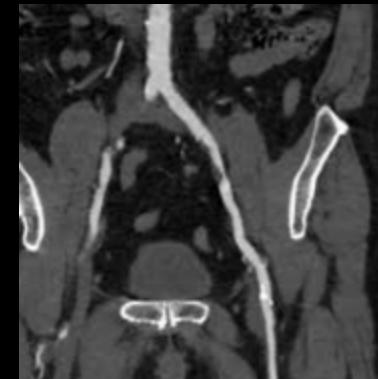
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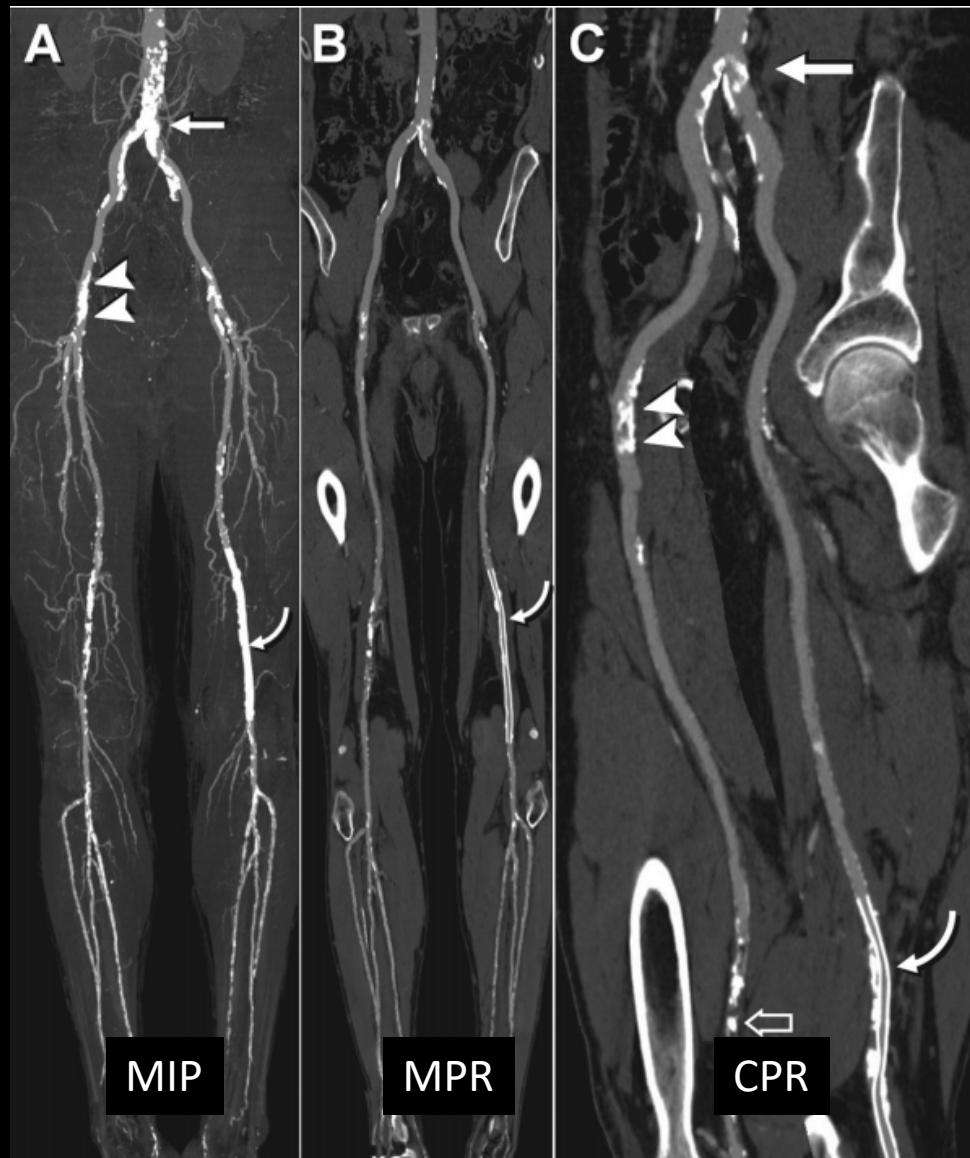


# Use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)

- More subtle narrowing of vessels (stenosis).



# Use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)

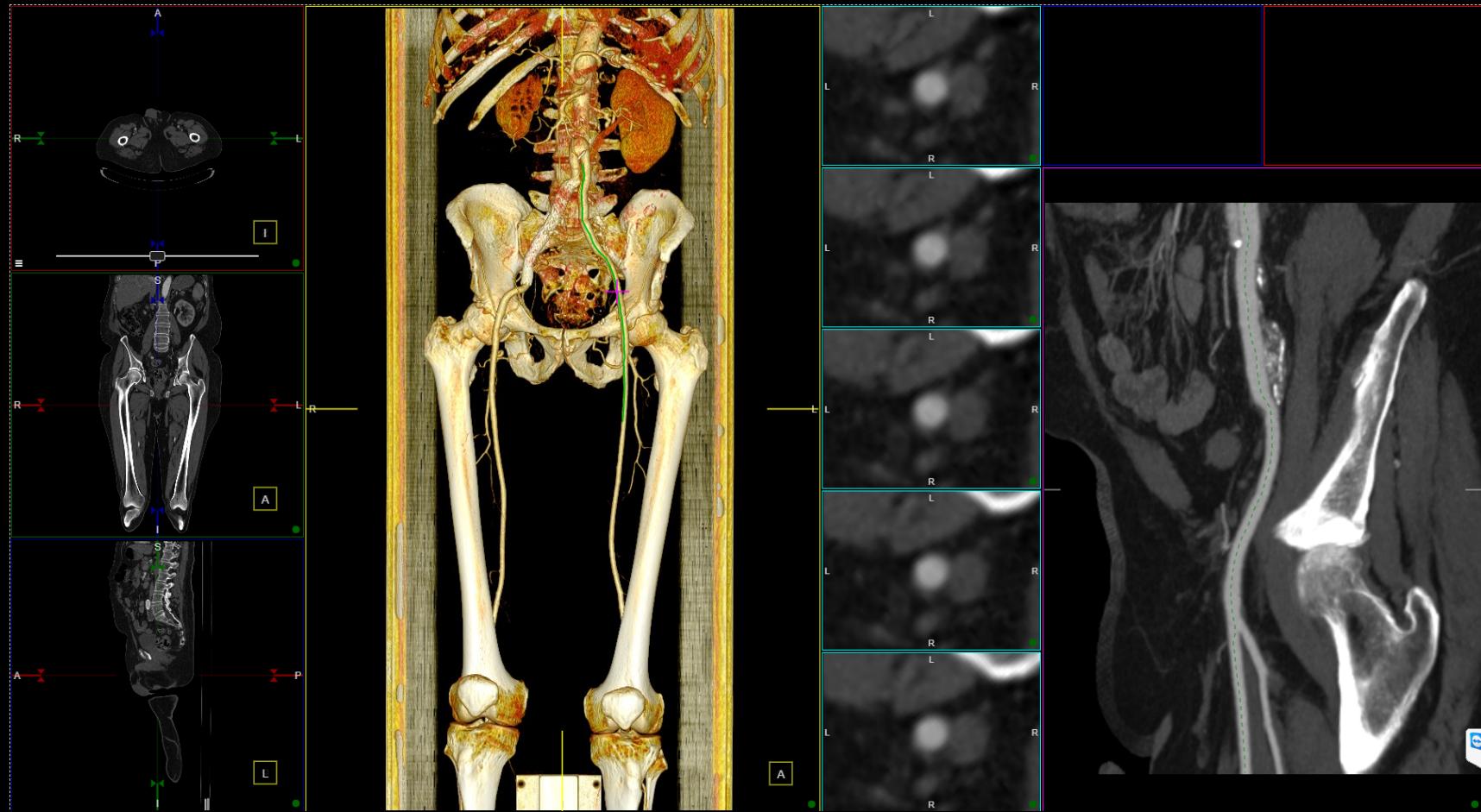


# Use of Computed Tomography (CT) angiography in Peripheral Artery Disease (PAD)

- Big challenges:
  - Difference between quick read vs. painful (literally) scrolling through images.
  - Axial (transverse) images inadequate.
  - Volumetric review of volumetric datasets.
- Need cross sections (MPR/CPR)
  - Try to delegate (3D-Lab, trained technologist) if routinely performing runoff CTAs

# Design of the Vessel Module

- Demo



# Overview

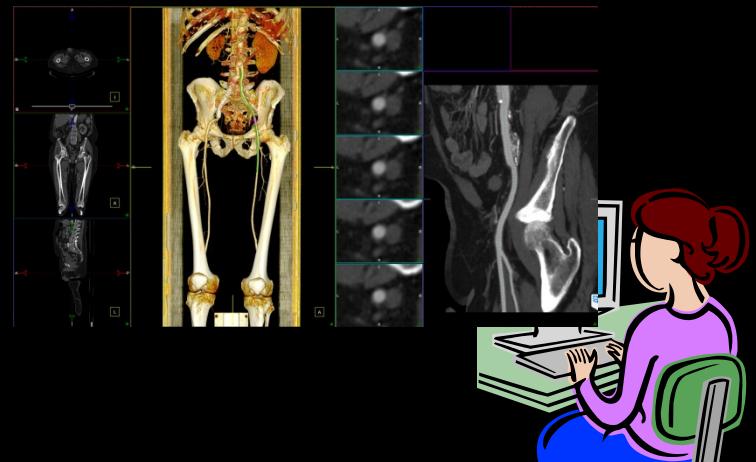
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  - Vessel Centerline Extraction
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# Design of the Vessel Module



Server

User Interface (web client)



# Design of the Vessel Module

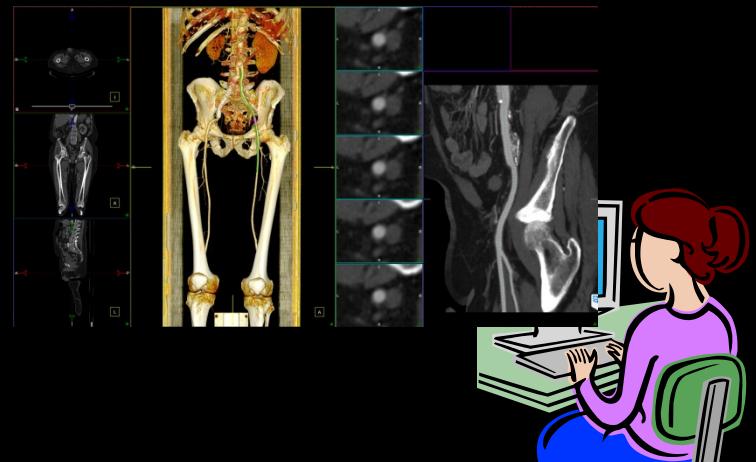


## Server

- Load data
- Process MPR, VR and CPR
- Process vessel extraction
- Talk to client

## User Interface (web client)

- User inputs
- Display MPR, VR and CPR
- Talk to server



# Design of the Vessel Module

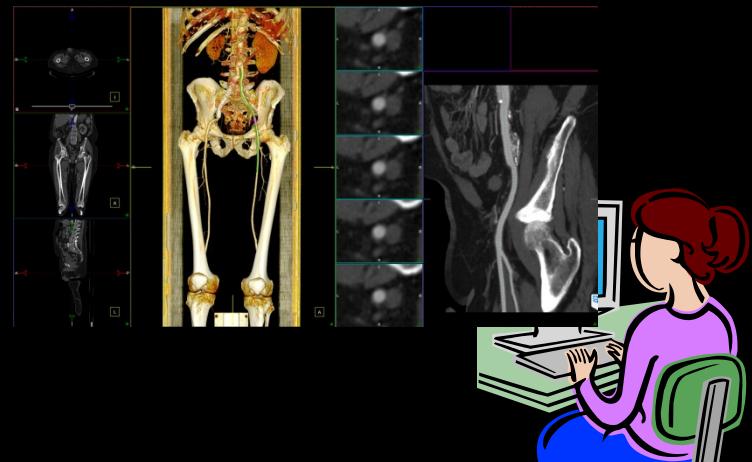


## Server

- Load data
- Process MPR, VR and CPR
- Process vessel extraction
- Talk to client

## User Interface (web client)

- User inputs
  - TrackedVesselMouseHandler
  - StenosisMouseHandler
- Display MPR, VR and CPR
- Talk to server
  - ITrackedVesselValue
  - IStenosisValue



# Design of the Vessel Module

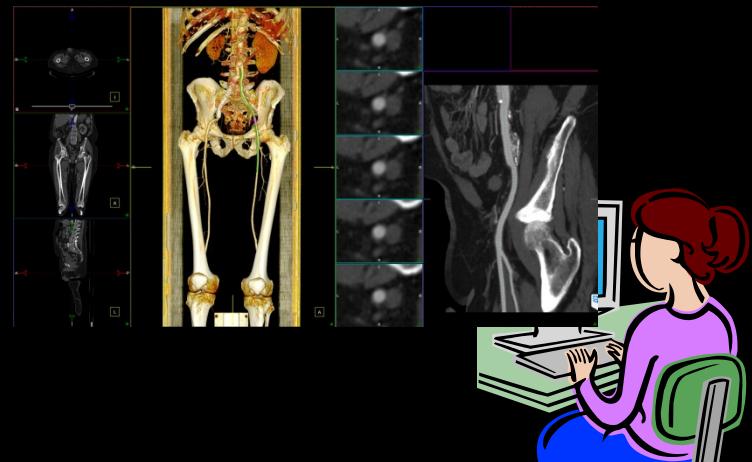


## Server

- Load data
- Process MPR, VR and CPR
- Process vessel extraction
  - ModuleProcessingQueue
  - CenterlineExtractionAlgorithm
- Talk to client
  - SegmentationVesselTrackResponse
  - SegmentationStenosisResponse

## User Interface (web client)

- User inputs
  - TrackedVesselMouseHandler
  - StenosisMouseHandler
- Display MPR, VR and CPR
- Talk to server
  - ITrackedVesselValue
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# Design of the Vessel Module (UI)

(... mouse messages handling ...)



mouse start dragging



mouse end dragging

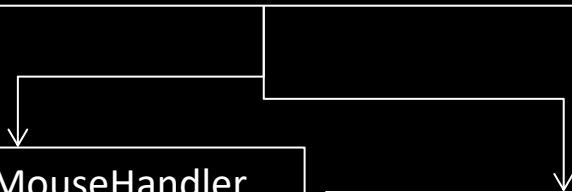
## User Interface (web client)

- User inputs
  - TrackedVesselMouseHandler
  - StenosisMouseHandler
- Display MPR, VR and CPR
- Talk to server
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# Design of the Vessel Module (UI)

Base class InternalMouseDragHandler

- OnMouseDownStart
- OnMouseDownEnd
- Polymorphic behaviour when dragging

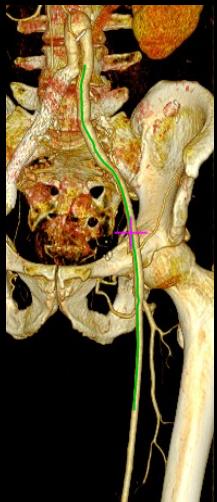


TrackedVesselMouseHandler

- OnMouseDownStart
- OnMouseDownEnd
- Create ITrackedVesselValue

StenosisMouseHandler

- OnMouseDownStart
- OnMouseDownEnd
- Create IStenosisValue



(... mouse messages handling ...)

InternalMouseDragHandler handler;



calls handler.OnMouseDownStart();



calls handler.OnMouseDownEnd();

User Interface (web client)

- User inputs
  - TrackedVesselMouseHandler
  - StenosisMouseHandler
- Display MPR, VR and CPR
- Talk to server
  - ITrackedVesselValue
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# Overview

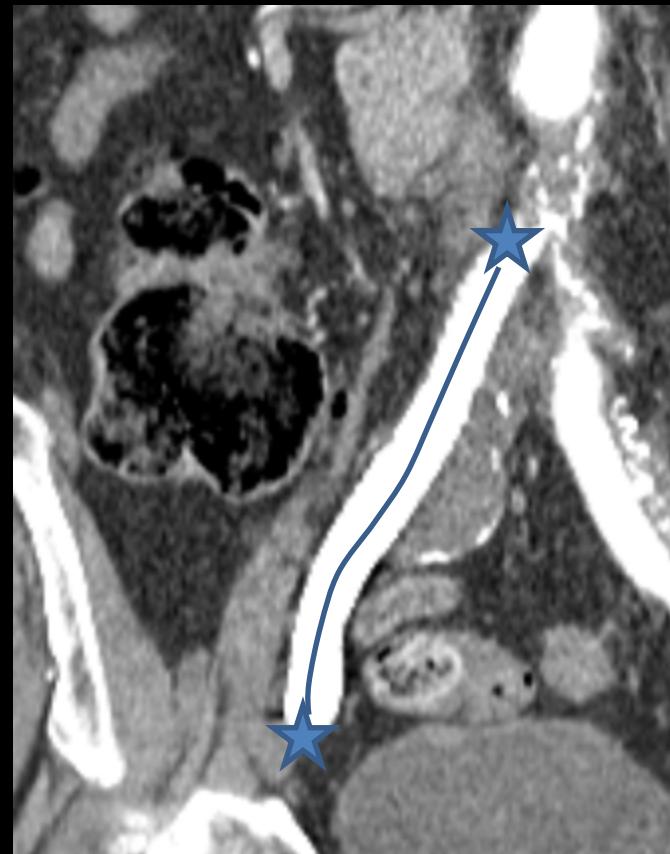
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# Implementation of the Vessel Module

- Vessel centerline extraction algorithm for CPR

Inputs:

- Two points
- Thresholds of vessel intensity

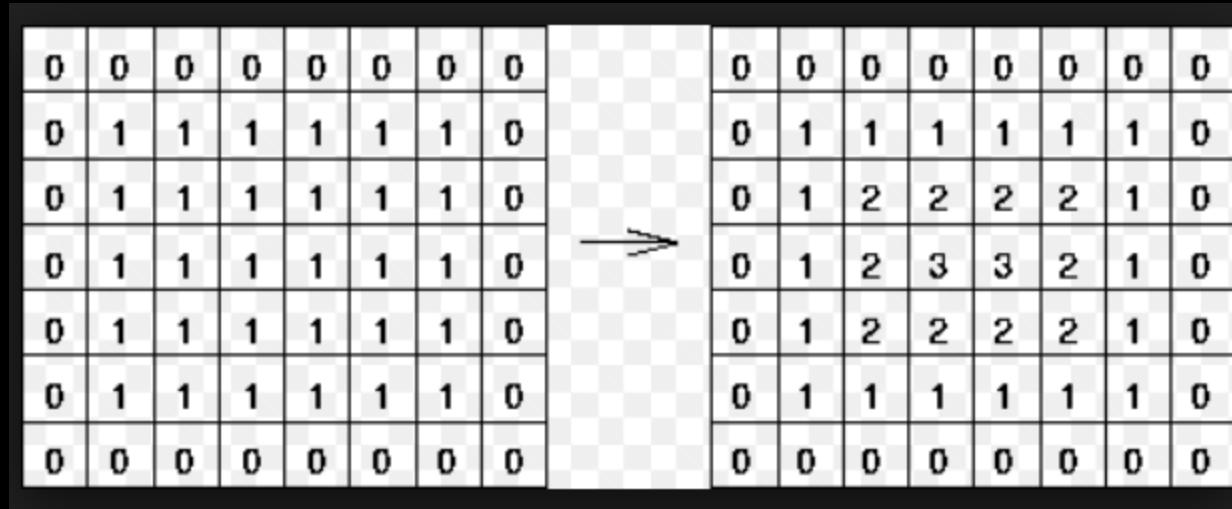


# Implementation of the Vessel Module

- Vessel centerline extraction algorithm for CPR
  - Distance transform
    - Labels each pixel of the image with the distance to the boundary pixel.
  - Shortest path
    - between the start and end points in the distance transform.

# Implementation of the Vessel Module

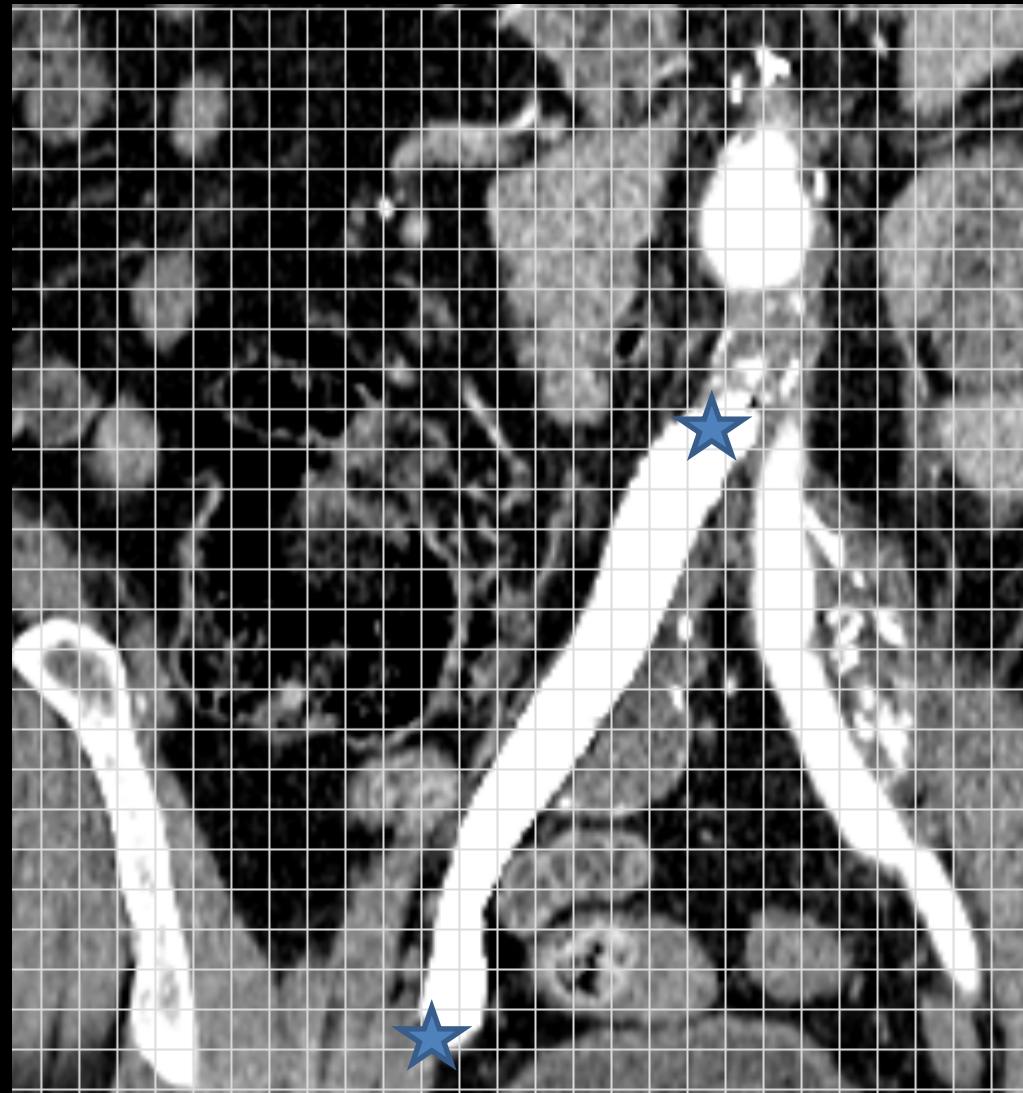
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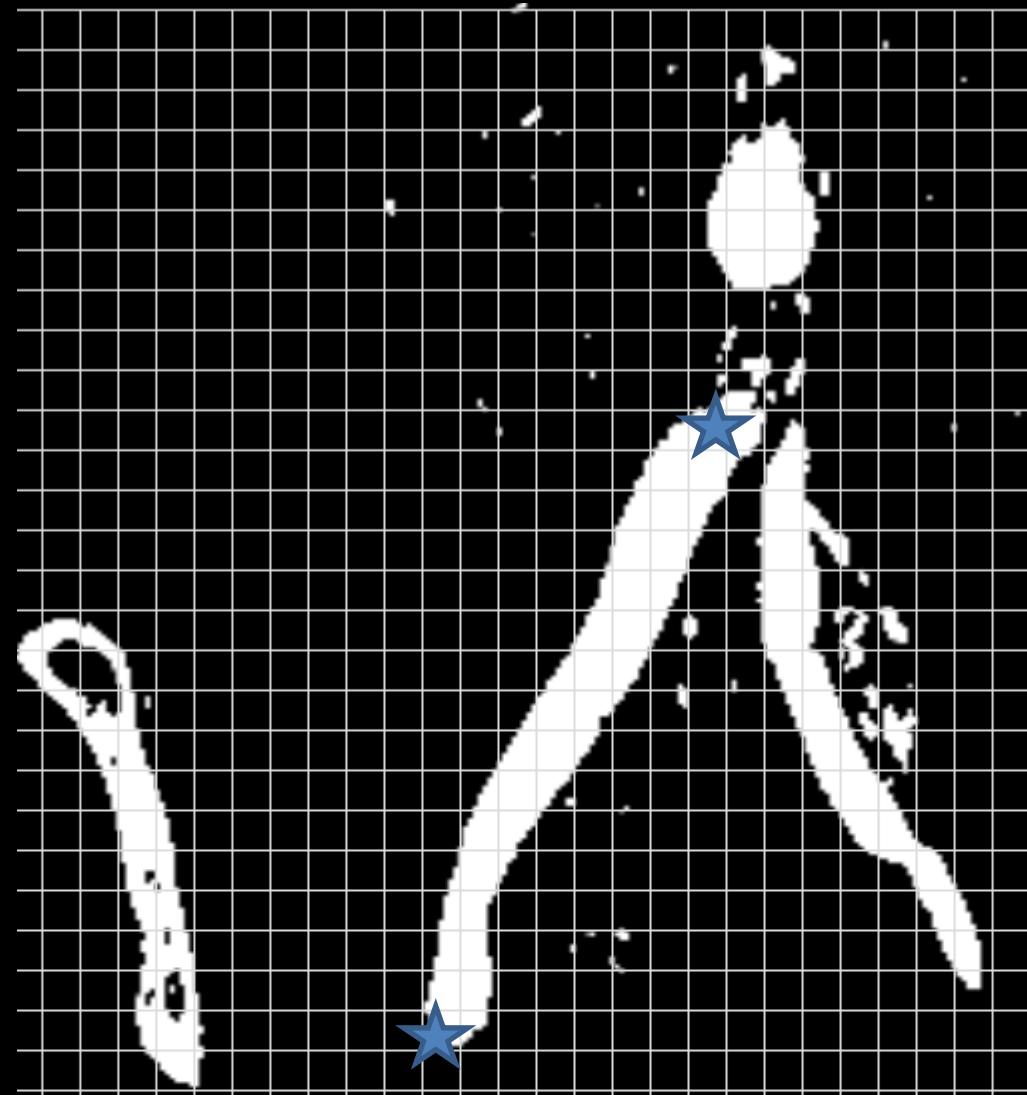
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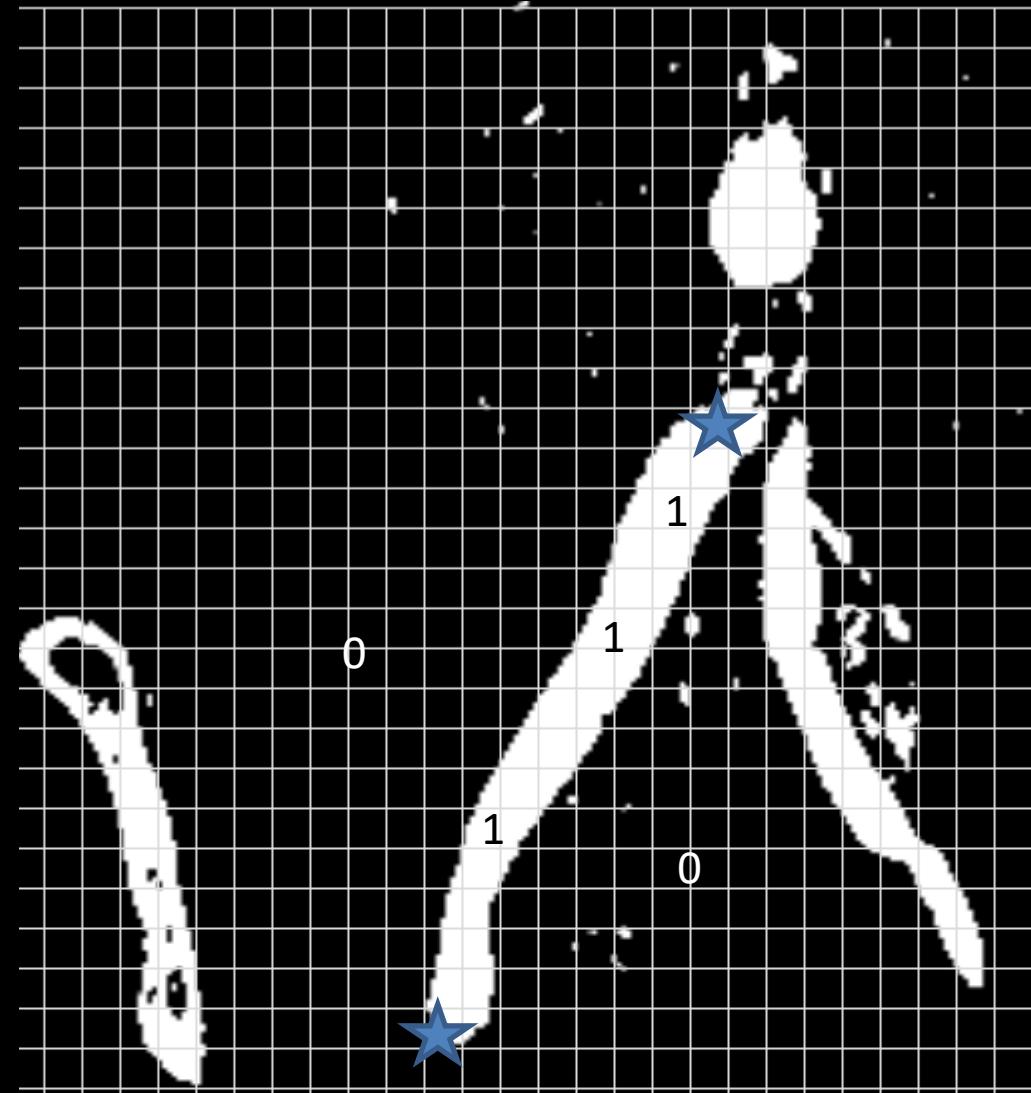
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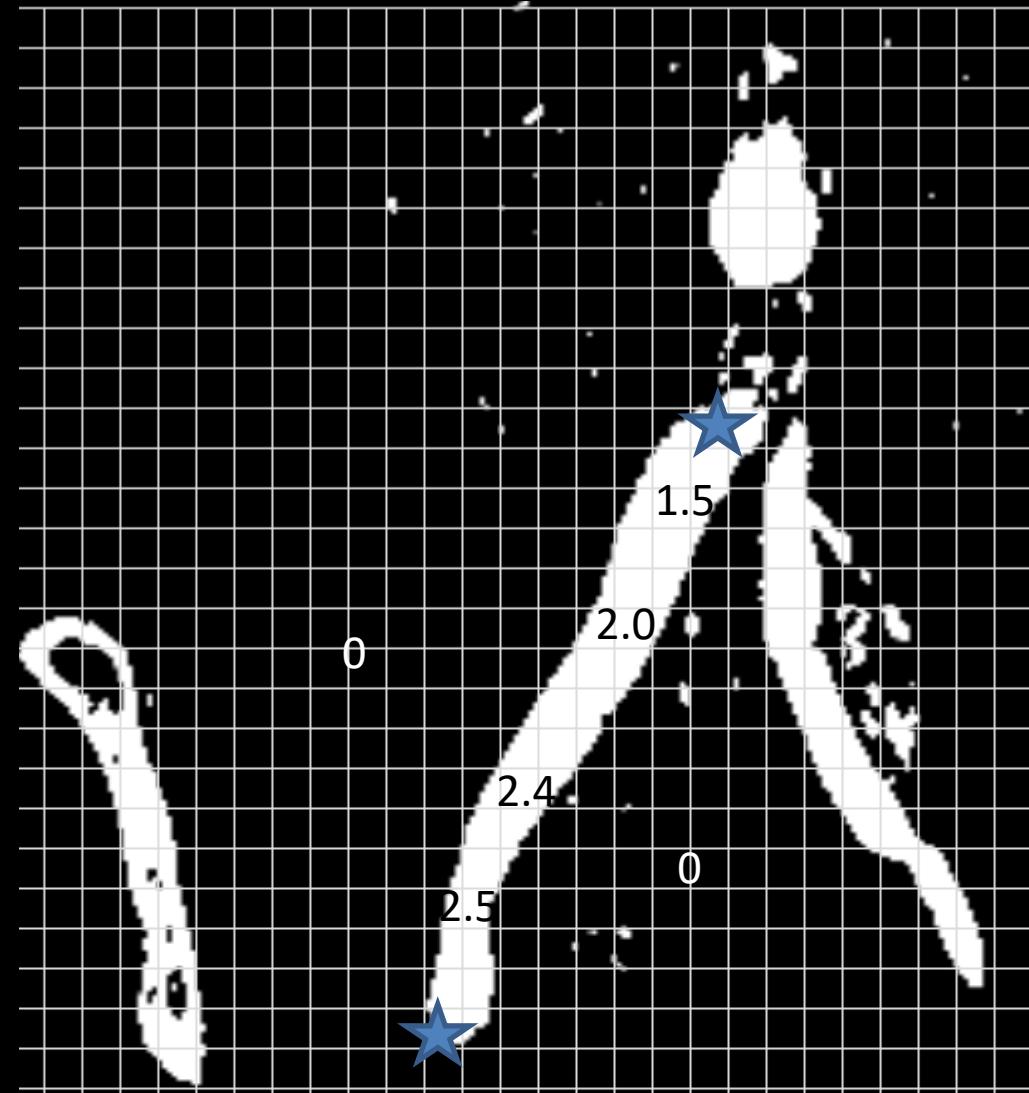
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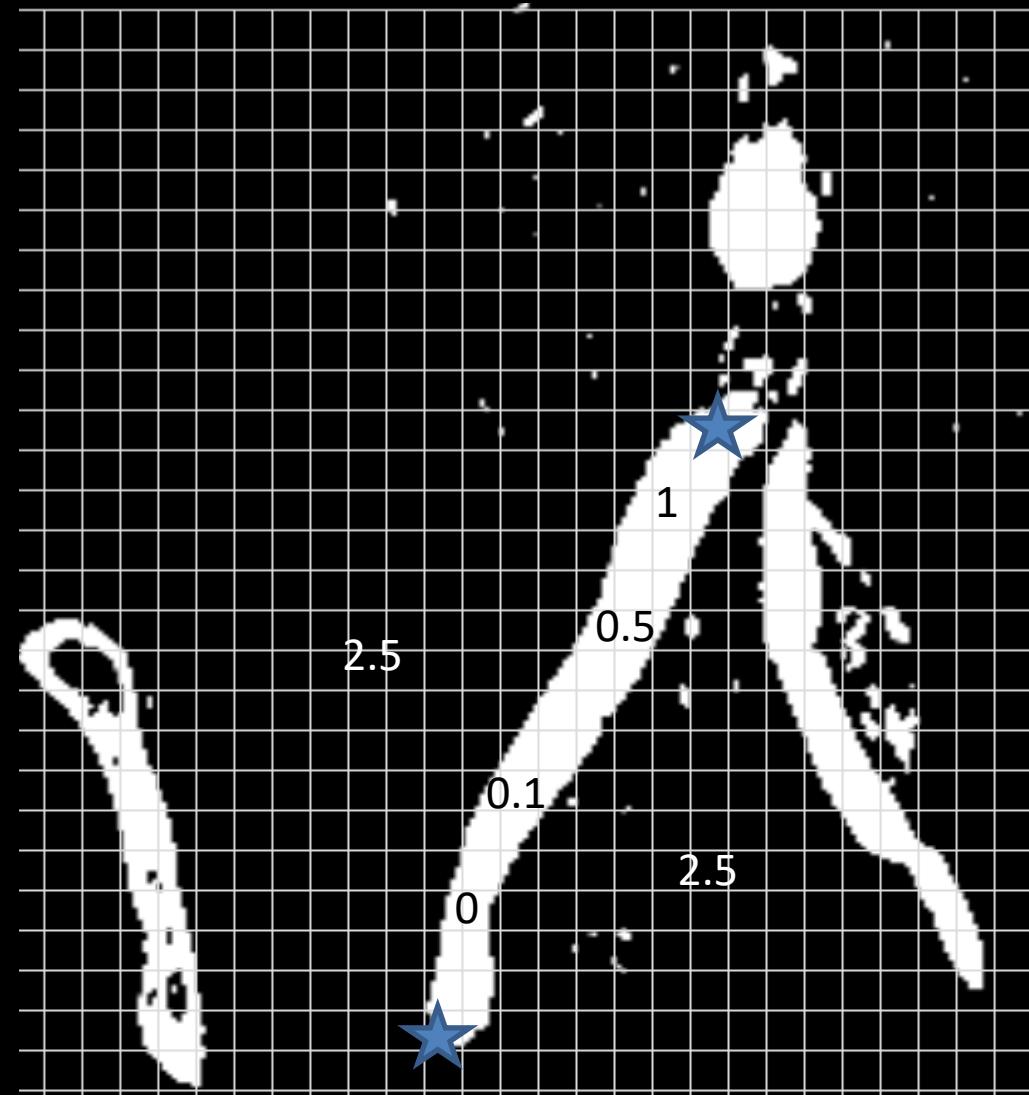
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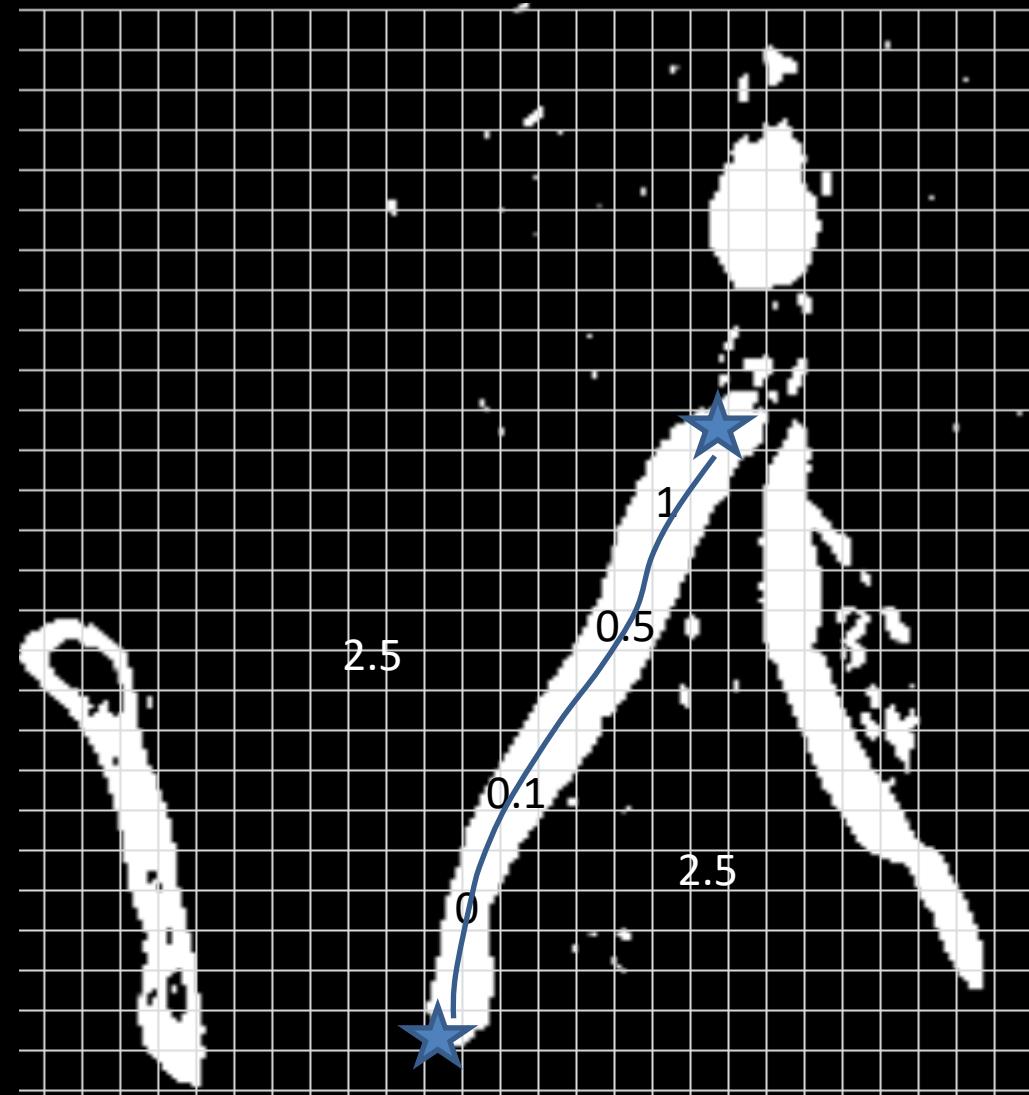
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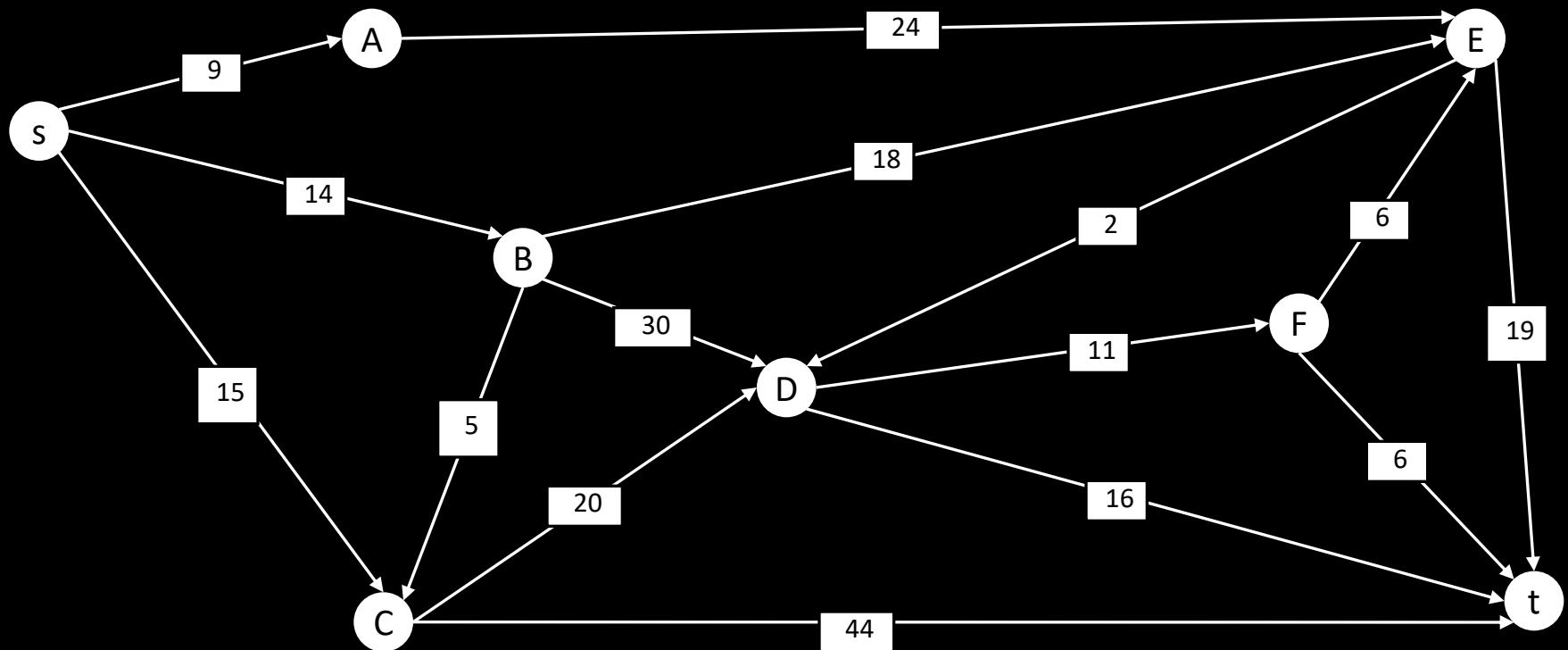
# Implementation of the Vessel Module

- Distance transform
  - Labels each pixel of the image with the distance to the boundary pixel.
- Shortest path
  - between the start and end points in the distance transform.



# Dijkstra's Shortest Path Algorithm

- Find shortest path from  $s$  to  $t$  – edges with non-negative weights.
- It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

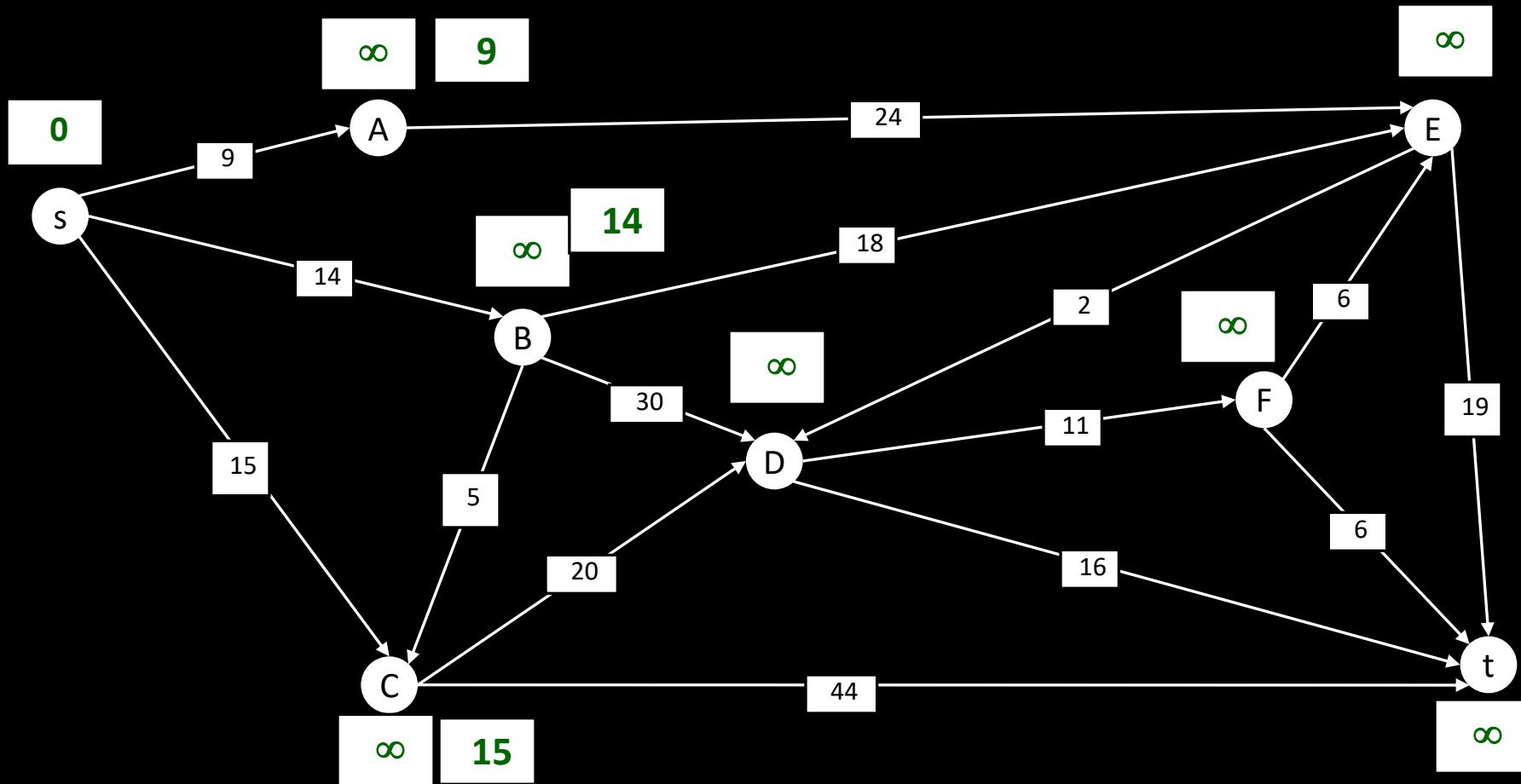


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { s, A, B, C, D, E, F, t }

Pick s

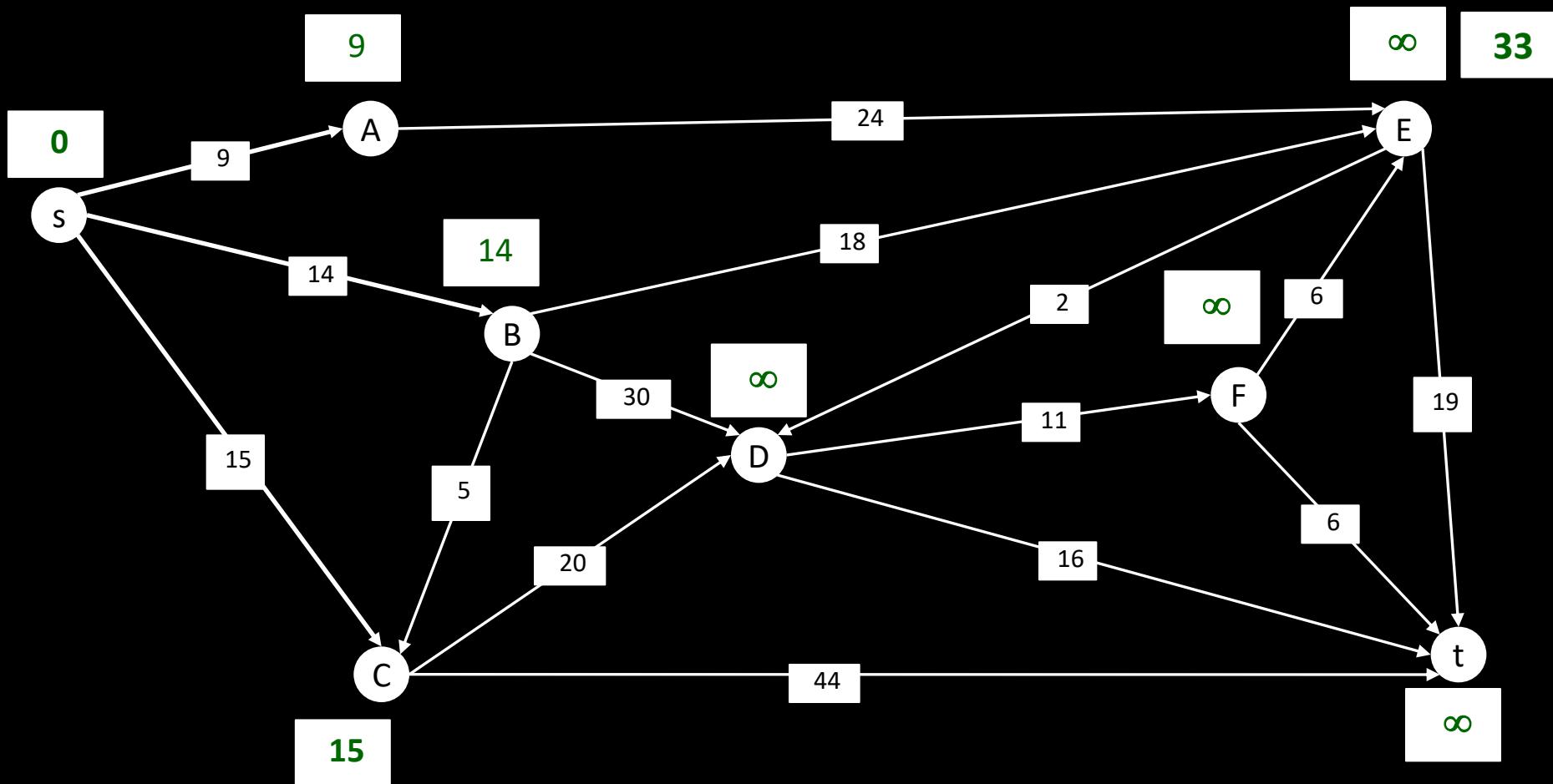


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { A, B, C, D, E, F, t }

Pick A

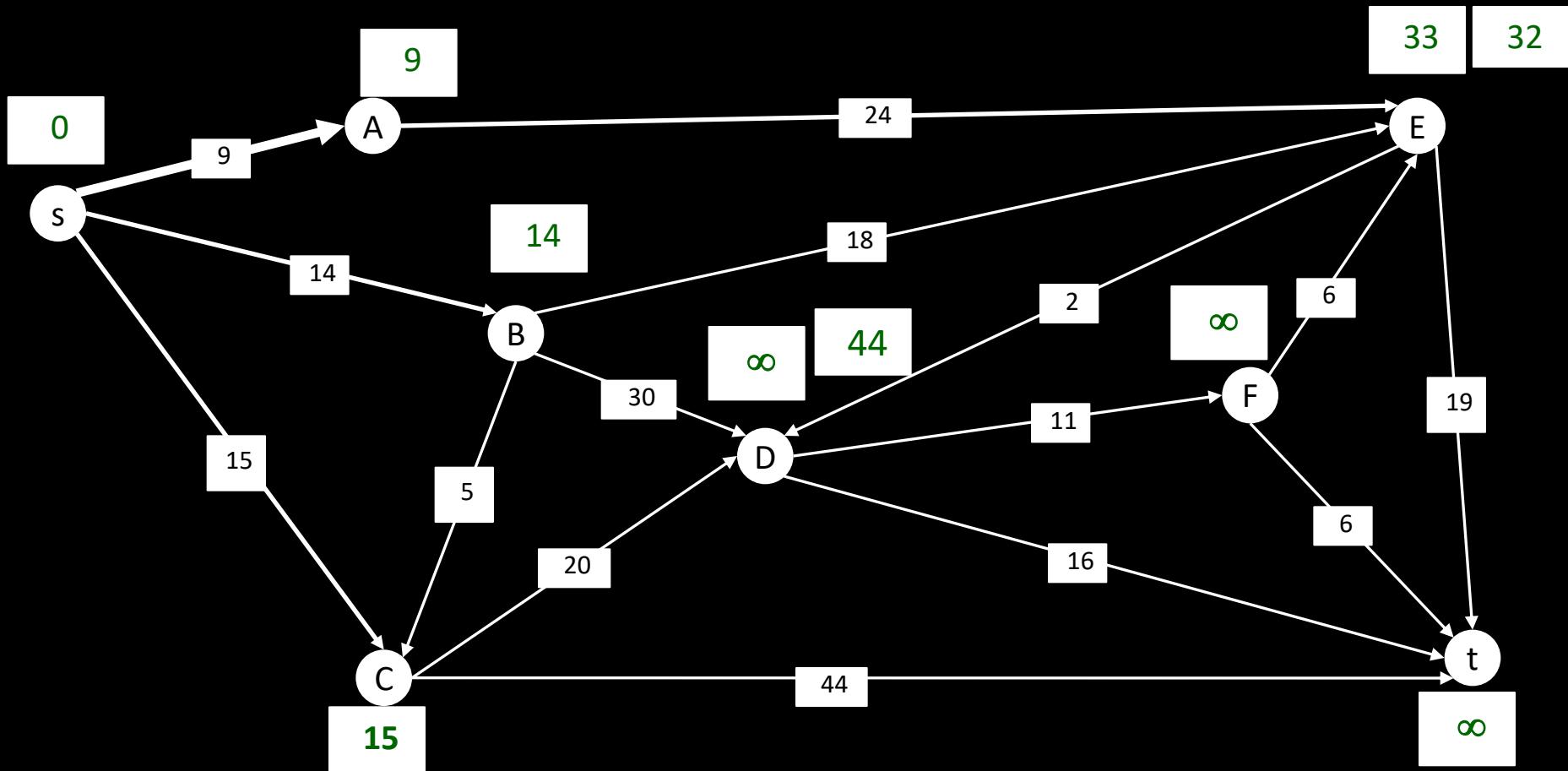


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { B, C, D, E, F, t }

Pick B

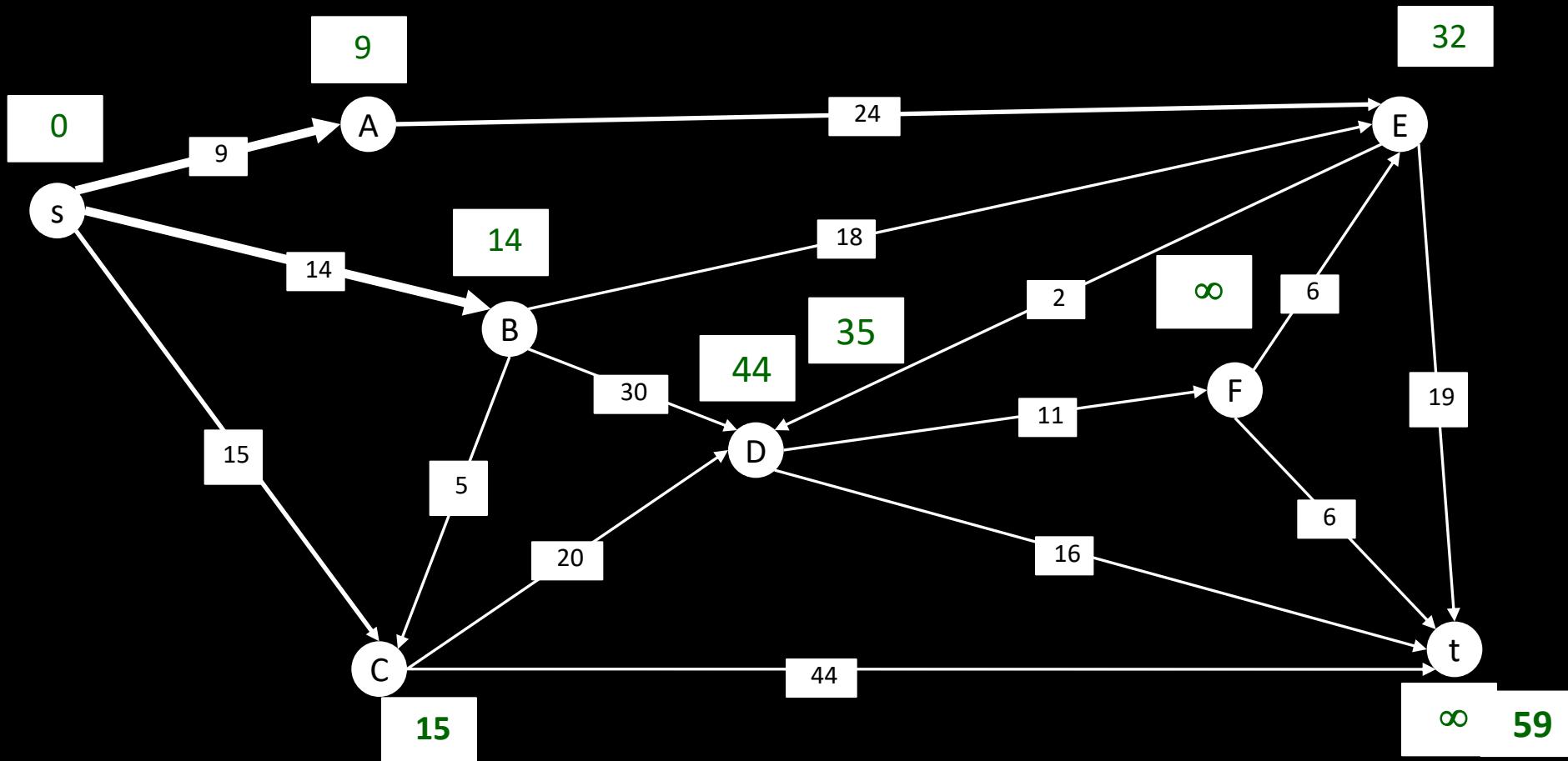


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { C, D, E, F, t }

Pick C

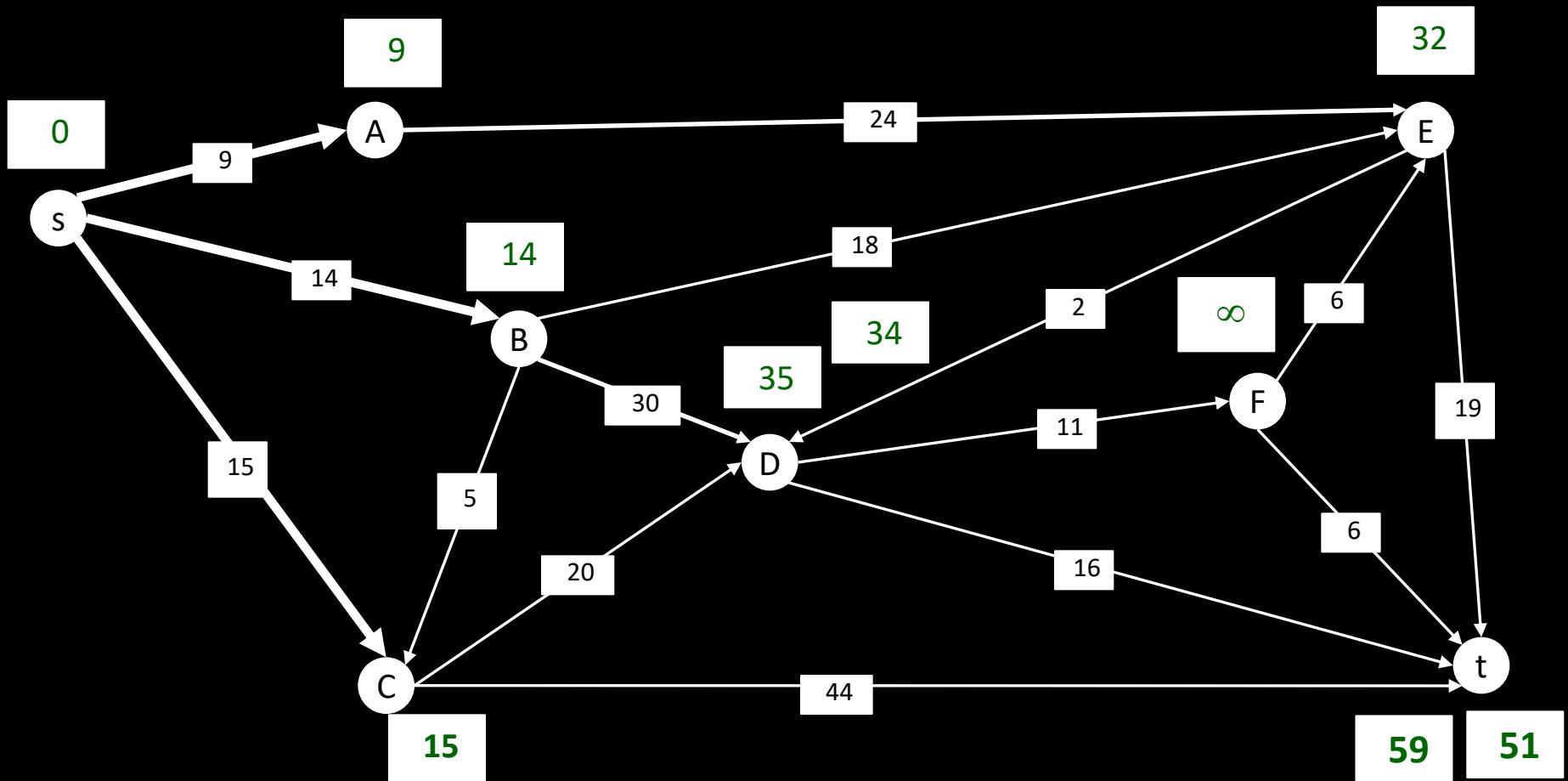


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { D, E, F, t }

Pick E

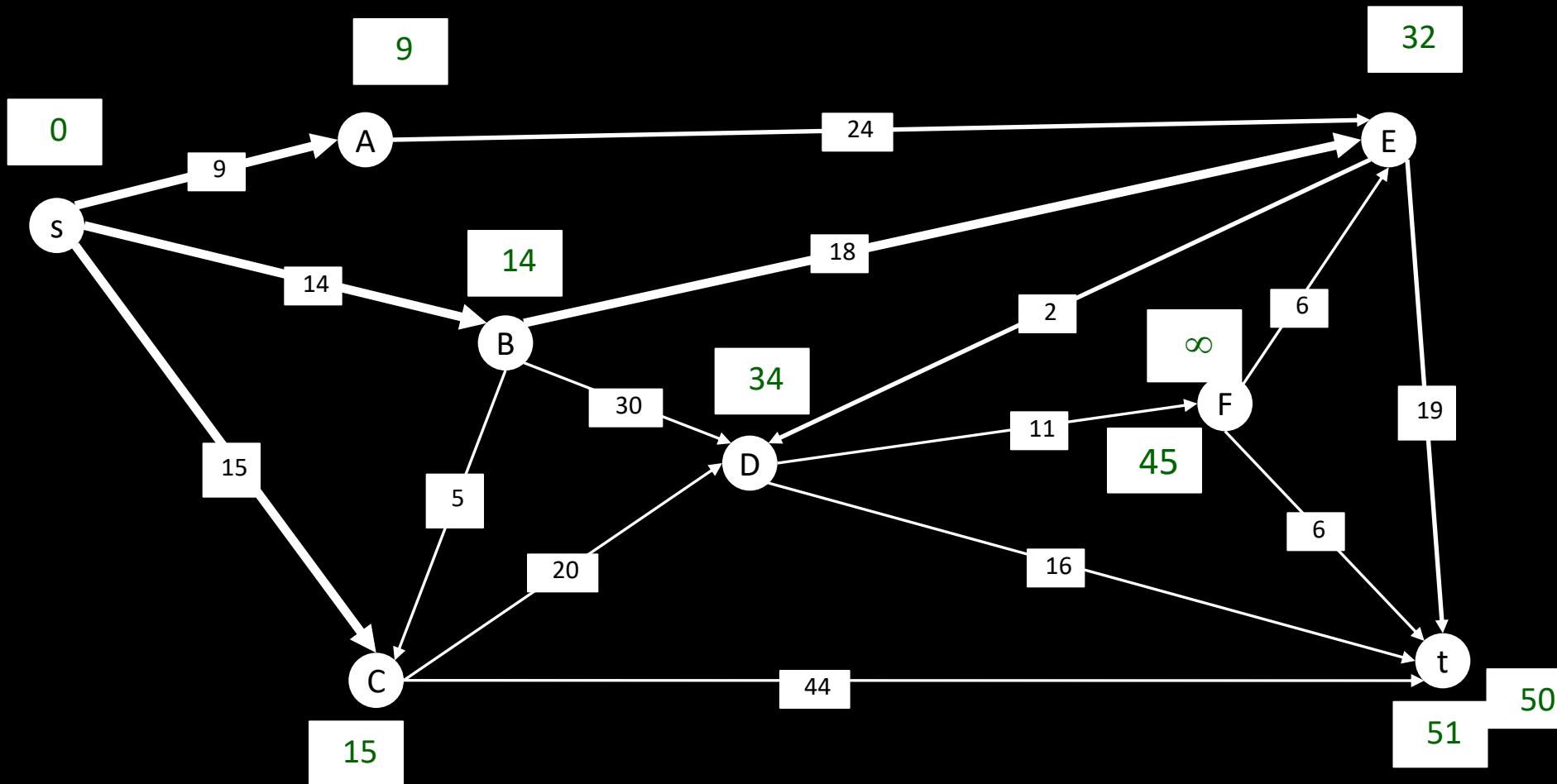


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { D, F, t }

Pick D

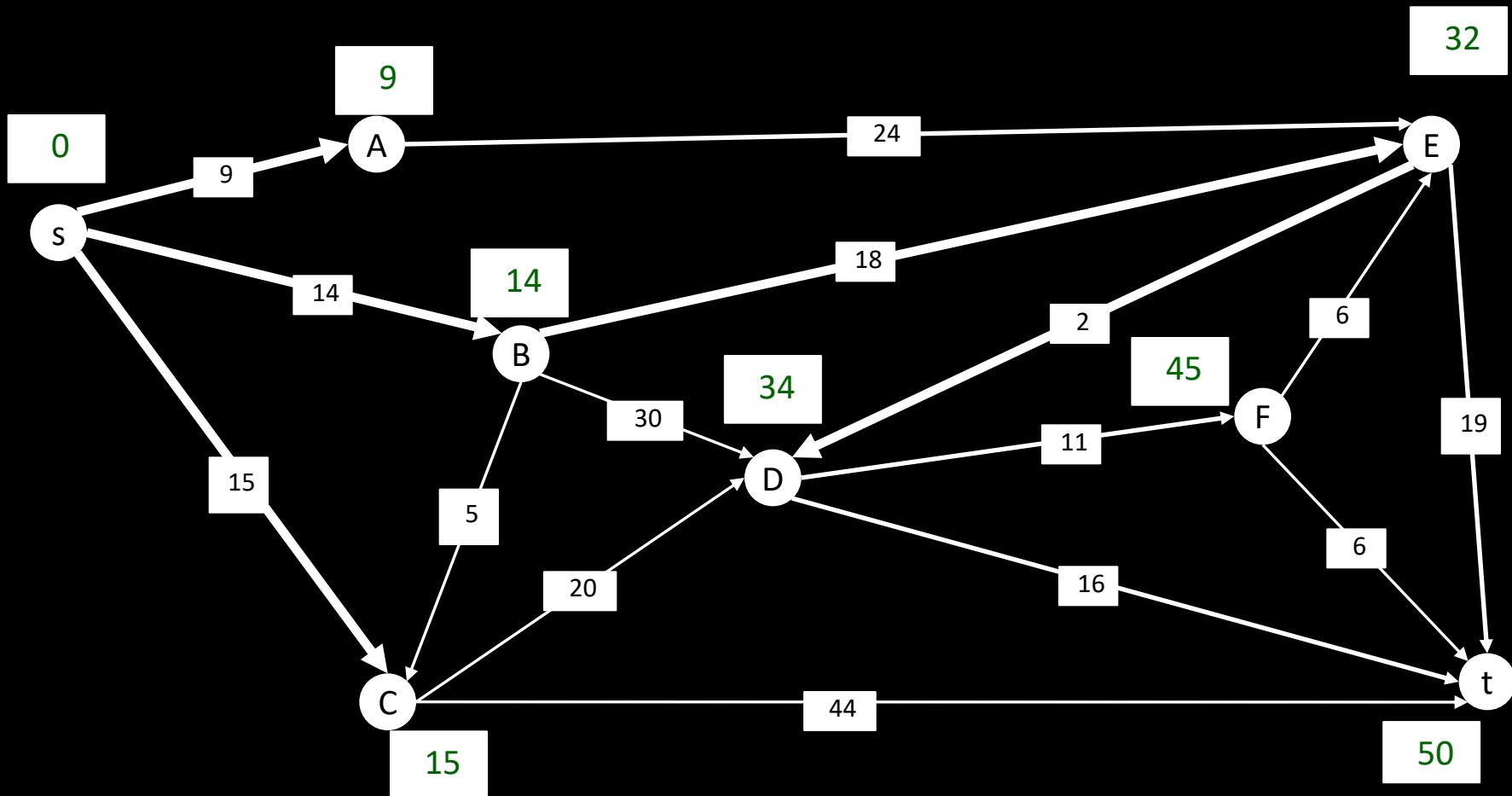


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { F, t }

Pick F

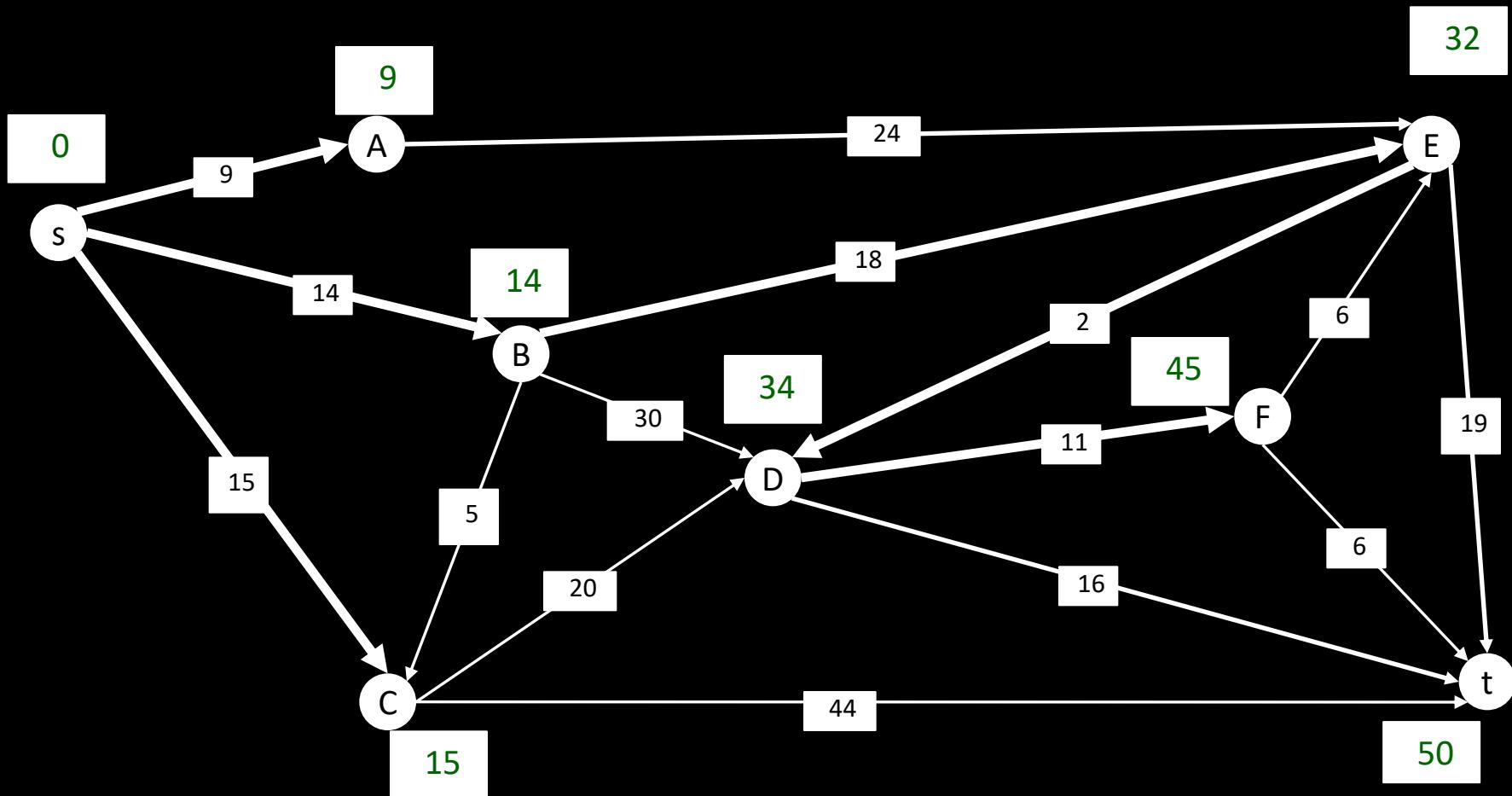


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { t }

Pick t

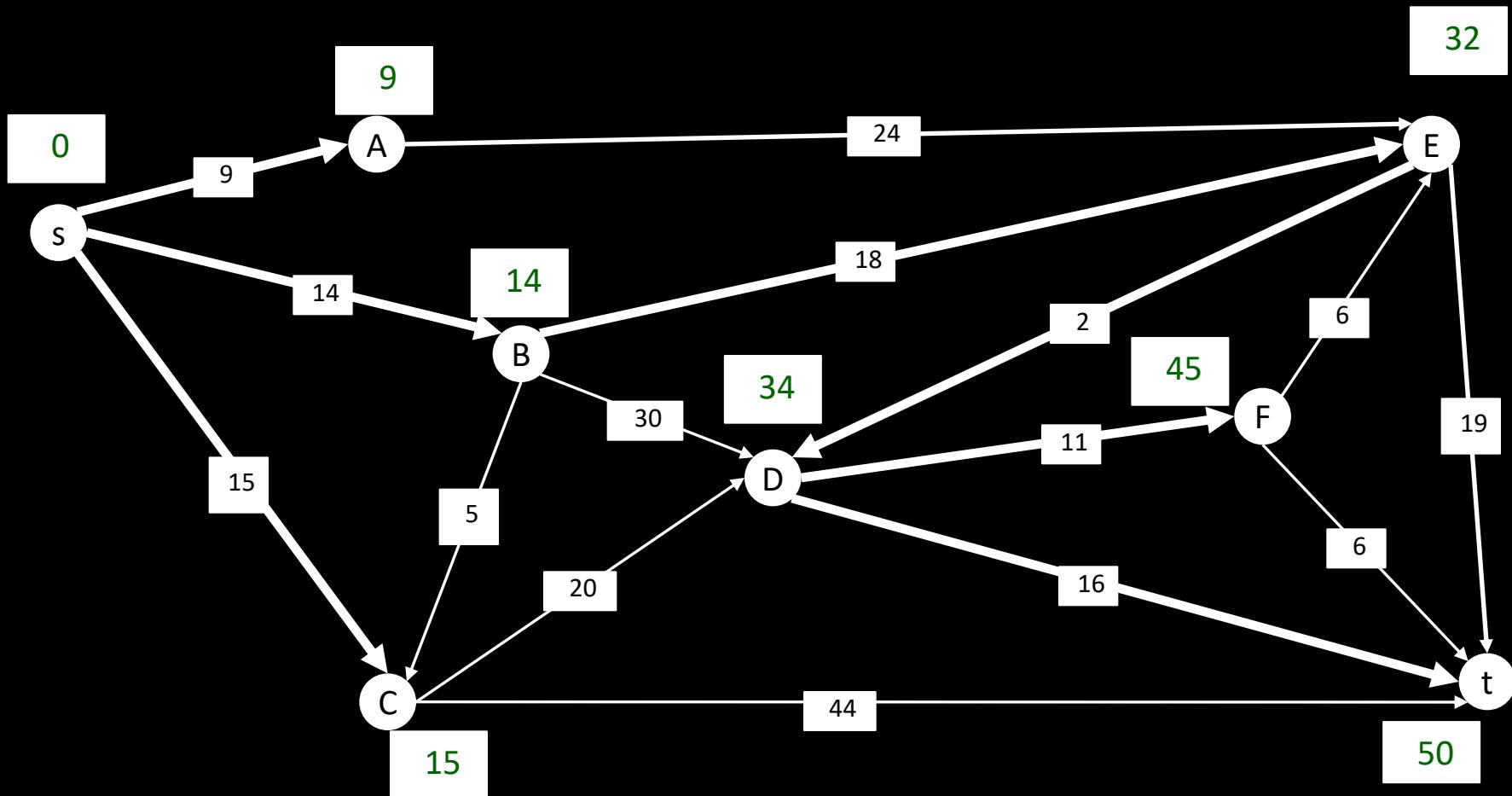


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { t }

Pick t

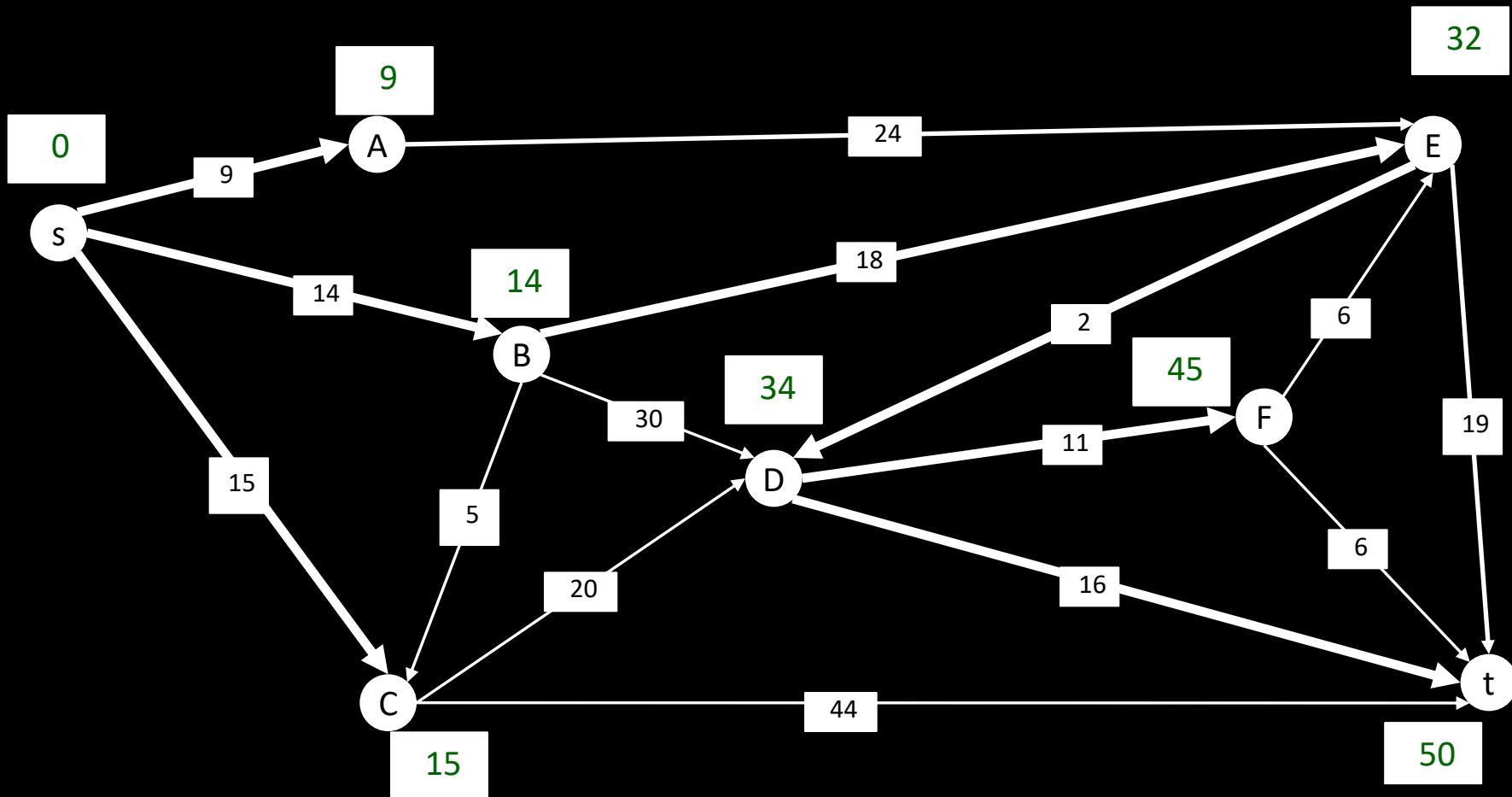


# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Work backward to find the shortest path between s and t....

t -> D -> E -> B -> s



# Dijkstra's Shortest Path Algorithm

It picks the unvisited vertex with the lowest distance, calculates the distance through it to each unvisited neighbour, and updates the neighbour's distance if smaller.

Nodes = { s, A, B, C, D, E, F, t }

Pick s

```
0
1 function Dijkstra(Graph, source):
2
3     create vertex set Q
4
5     for each vertex v in Graph:           // Initialization
6         dist[v] ← INFINITY               // Unknown distance from source to v
7         prev[v] ← UNDEFINED              // Previous node in optimal path from source
8         add v to Q                      // All nodes initially in Q (unvisited nodes)
9
10    dist[source] ← 0                  // Distance from source to source
11
12    while Q is not empty:            // Node with the least distance
13        u ← vertex in Q with min dist[u] // will be selected first
14
15        remove u from Q
16
17        for each neighbor v of u:      // where v is still in Q.
18            alt ← dist[u] + length(u, v)
19            if alt < dist[v]:          // A shorter path to v has been found
20                dist[v] ← alt
21                prev[v] ← u
22
23    return dist[], prev[]
```

What data structure or class from STL we should use to keep the set of nodes?

C

44

t

30

# Implementation of the Vessel Module

- Running time of the algorithm depends on the time used to
  - Pick the node with the minimal cost and remove it ( $T_p$ )
  - Update the cost ( $T_u$ )
- Total run time  $\sim |E| * T_u + |N| * T_p$
- What data structure?
  - `std::vector` ?
  - `std::map` ?
  - ???

# Implementation of the Vessel Module

- Total run time  $\sim |E| * Tu + |N| * Tp$
- std::vector
- $Tu = ?$ 
  - Constant update time  $O(1)$
- $Tp = ?$ 
  - Find the minimal cost by going through the list of nodes and remove it.
  - $O(N)$
- $O(|E| + |N| * |N|)$

Nodes = { s, A, B, C, D, E, F, t }

Pick s

# Implementation of the Vessel Module

- Total run time  $\sim |E| * Tu + |N| * Tp$
- std::map
  - Key as the cost, Value as the pointer to the node.
- $Tu = ?$ 
  - Doesn't directly support updating the key
  - By adding and removing the element
  - $O(\log(N))$
- $Tp = ?$ 
  - Find the minimal cost by getting the first element (already sorted) and remove it.
  - $O(\log(N))$
- $O(|E| * \log |N| + |N| * \log |N|) \sim O(|E| * \log |N|)$

Nodes = { s, A, B, C, D, E, F, t }

Pick s

# Implementation of the Vessel Module

- Total run time  $\sim |E| * Tu + |N| * Tp$
- std::priority\_queue
- Store the cost and node in one class and define a function to compare between two objects of the new class.
- Same as std::map

Nodes = { s, A, B, C, D, E, F, t }

Pick s

# Implementation of the Vessel Module

- Total run time  $\sim |E| * Tu + |N| * Tp$
- Fibonacci heap
- $Tu = ?$ 
  - Amortized constant  $O(1)$
- $Tp = ?$ 
  - Amortized  $O(\log(N))$
- $|E| + |N| * \log|N|$

Nodes = { s, A, B, C, D, E, F, t }

Pick s

# Implementation of the Vessel Module

- Total run time  $\sim |E| * Tu + |N| * Tp$
- std::vector
  - $|E| + |N| * |N|$
- std::map
  - $|E| * \log|N|$
- std::priority\_queue (same as std::map)
  - $|E| * \log|N|$
- Fibonacci Heap
  - $|E| + |N| * \log|N|$

# Implementation of the Vessel Module

```
typedef std::pair<float4, PositionPair> CostPositionPair;

// Set of the nodes .
std::priority_queue<CostPositionPair, std::vector<CostPositionPair>, CostPositionPairComparitor>
mapBuckets;
// Push the source node.
mapBuckets.push(start_point);

while (mapBuckets.size() > 0)
{
    const auto& minNode = mapBuckets.top();
    // remove position from the buckets
    mapBuckets.pop();
    // Break if the minNode is the destination.
    if (minNode == end_point) break;

    // update costs of the 26 neighbours
    for (int i = 0; i < 26; ++i)
    {
        // ..... if the new cost is smaller than the existing cost, update the cost.
        if (fTmp < vNeighValsCost[iIndex])
            mapBuckets.push(CostPositionPair(fTmp, PositionPair(uCellOff, uValOff)));
    }
}
```

# Overview

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# Testing

- Cannot emphasize enough the importance of testing.
- Definitely not the last thing you do in the development.
- Different levels of testing
  - Unit testing
  - Functional testing
  - Acceptance testing
- On phantom data
- On different data

# Testing

- Unit testing
  - Smallest testable part of an application, e.g. a function in some math class.
  - Lots of different frameworks, CTest, Cppunit (e.g. see <https://stackoverflow.com/questions/91384/unit-testing-for-c-code-tools-and-methodology>)
- Functional testing
  - The system is tested against the functional requirements or specifications, e.g. is the ruler measurement correct?
  - Use of phantom and different data.
- Acceptance testing
  - The system is tested for compliance with the business requirements and assess whether it is acceptable for delivery.
  - E.g. does it actually solve the problem of the end users?

# Reusability

- Different levels of reusability
- Reusable functions and classes
- Reusable “software components”
- Needs some more domain knowledge.
- For example, other modules may use similar components.....

# Reusability

- Different levels of reusability
- Reusable functions and classes
- Look at the bigger picture – reusable “software components”
- Needs some more domain knowledge.
- For example, other modules may use similar components.....

# Reusability

- Horizontal CPR in dental application.
- The module and the whole CPR components should be reusable to allow to “plug together” another module.



# Take Home Messages ...

- Know the use cases and requirements
- Design patterns are used to help to build a solid foundation.
- STL provides a ranges of data structures and algorithms for efficient software development ...
- ... but, carefully pick the correct data structures for the job.
- Testing ... Testing ... Testing ...

# Questions?

## P.9: Don't waste time or space

Example, bad

```
void lower(zstring s)
{
    for (int i = 0; i < strlen(s); ++i) s[i] = tolower(s[i]);
}
```