

# Outlines

- Informed Search
- Heuristic
- Heuristic Search
- Heuristic Function
- Best First Search
- Greedy Best First Search
- A\* Search

# Informed Search

- Uninformed search strategies can find solutions to problems by systematically generating new states and testing them against the goal.
- Unfortunately, these strategies are incredibly inefficient in most cases.
- Uninformed search uses problem-specific knowledge—can find solutions more efficiently.

# Heuristic

- Heuristic means:
  - *To discover*
  - *Helping to discover or learn*
  - *Serving to discover*
  - *An aid to discover*
- Heuristics are "rules of thumb", educated guesses, intuitive judgments or simply common sense.
- A heuristic contributes to the reduction of search in a problem-solving activity.

# Heuristic

- "Educated guess" is a heuristic that allows a person to reach a conclusion without exhaustive research.
- With an educated guess a person considers what they have observed in the past, and applies that history to a situation where a more definite answer has not yet been decided.

# Heuristic Search

- Uses domain-dependent (heuristic) information in order to search the space more efficiently.

## **Ways of using heuristic information:**

- Deciding which node to expand next, instead of doing the expansion in a strictly breadth-first or depth-first order.
- In the course of expanding a node, deciding which successor or successors to generate, instead of blindly generating all possible successors at one time.
- Deciding that certain nodes should be discarded, or pruned, from the search space.

# Heuristic Search

- A moment's reflection will show ourselves constantly using heuristics in the course of our everyday lives.
- If the sky is grey we conclude that it would be better to put on a coat before going out.
- We book our holidays in August because that is when the weather is best.

# Heuristic Function

- A heuristic function,  $h(n)$ , provides an estimate of the cost of the path from a given node to the closest goal state.
- Must be zero if node represents a goal state.

# Best First Search

- Depth first search is good because it allows a solution to be found without all competing branches to be expanded.
- Breadth first search is good because it does not get trapped on dead-end paths.
- Best First Search combines the advantages of the two.
- At each step of the best first search process, we select the most promising of the nodes we have generated so far.
- This is done by applying an appropriate heuristic function to each of them.



# Best First Search

- An algorithm in which a node is selected for expansion based on an evaluation function  $f(n)$ .
  - *Traditionally the node with the lowest evaluation function is selected*
  - *Not an accurate name...expanding the best node first would be a straight march to the goal.*
  - *Choose the node that appears to be the best*

# Best First Search

- There is a whole family of Best-First Search algorithms with different evaluation functions.
- Each has a heuristic function  $h(n)$ .
- $h(n)$  = estimated cost of the cheapest path from node  $n$  to a goal node.
- Example: In route planning the estimate of the cost of the cheapest path might be the straight line distance between two cities.

# Best First Search

- **$g(n)$**  = Cost from the initial state to the current state  $n$ .
- **$h(n)$**  = Estimated cost of the cheapest path from node  $n$  to a goal node.
- **$f(n)$**  = Evaluation function to select a node for expansion (usually the lowest cost node).

# Greedy Best First Search

- Greedy Best-First search tries to expand the node that is closest to the goal assuming it will lead to a solution quickly

$$f(n) = h(n)$$

- $f(n)$  = Function that gives an evaluation of the state.
- $h(n)$  = The cost of getting from the current state to a goal state.

# Greedy Best First Search

- The Greedy Best-First-Search algorithm works as uniform cost search, except that it has some estimate (called a heuristic) of how far from the goal any node is.
- Instead of selecting the node closest to the starting point, it selects the node closest to the goal.
- Greedy Best-First-Search is not guaranteed to find a shortest path.
- However, it runs much quicker than uniform cost search algorithm because it uses the heuristic function to guide its way towards the goal very quickly.

# Greedy Best First Search

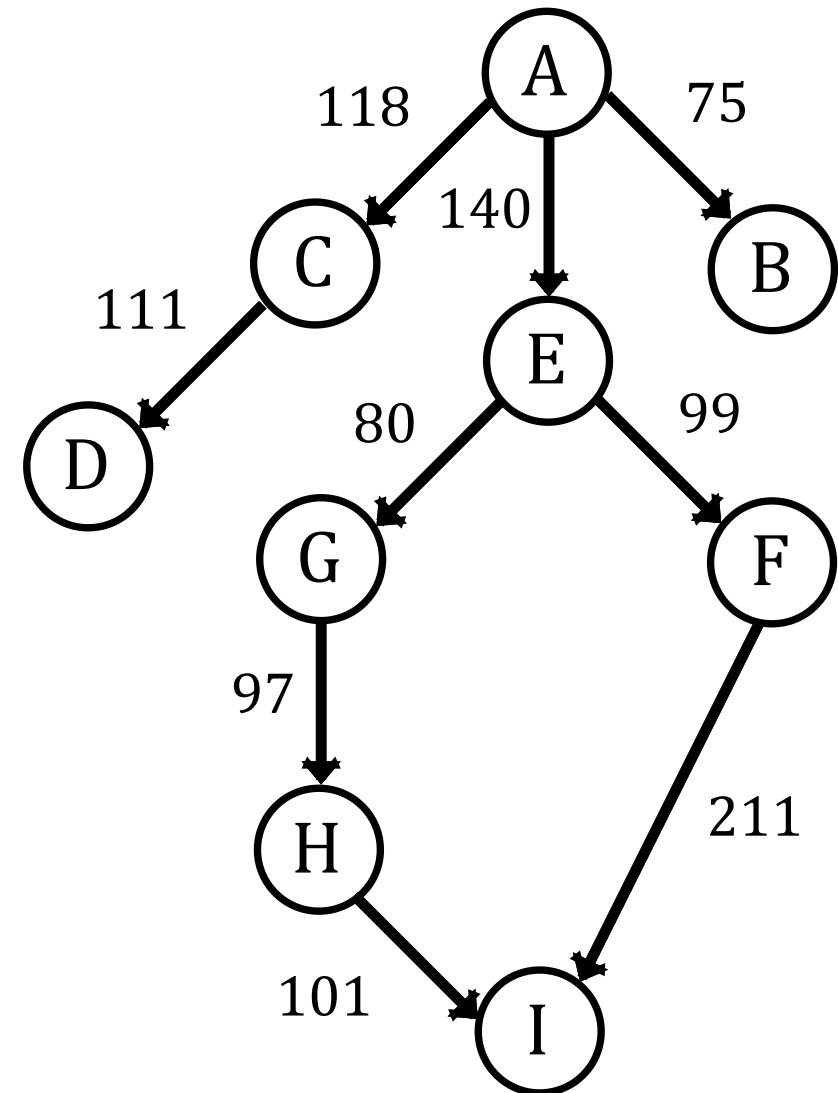
## Algorithm:

- Step 01: Initialize Queue with Starting Node.
- Step 02: Pick the path with minimum heuristic cost  $f(n)=h(n)$  from Queue.
- Step 03: If the minimum path is goal, stop algorithm you found the solution.
- Step 04: For each neighbor node  $v$  add expanded path  $\langle v, P \rangle$  to Queue.
- Step 05: Repeat Step 02 to Step 04 until Queue is empty.

# Greedy Best First Search (Problem 01)

■ A = Initial State

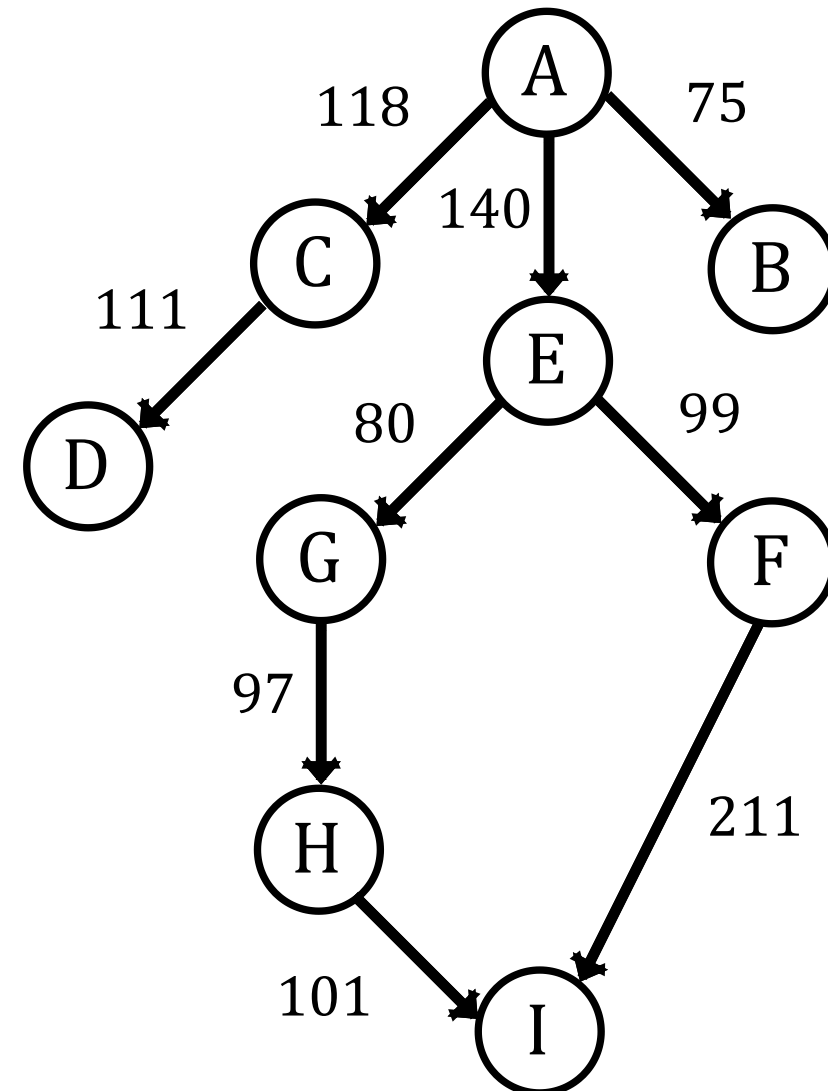
■ I = Goal State



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0

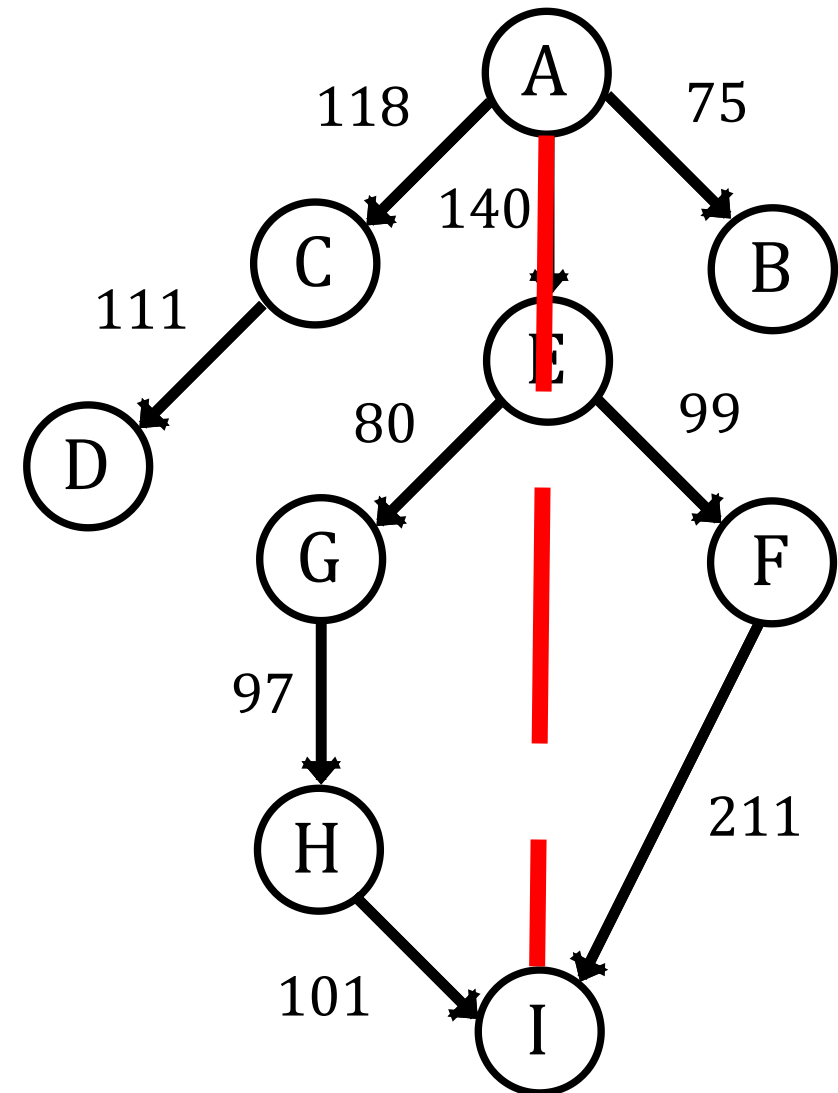




# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

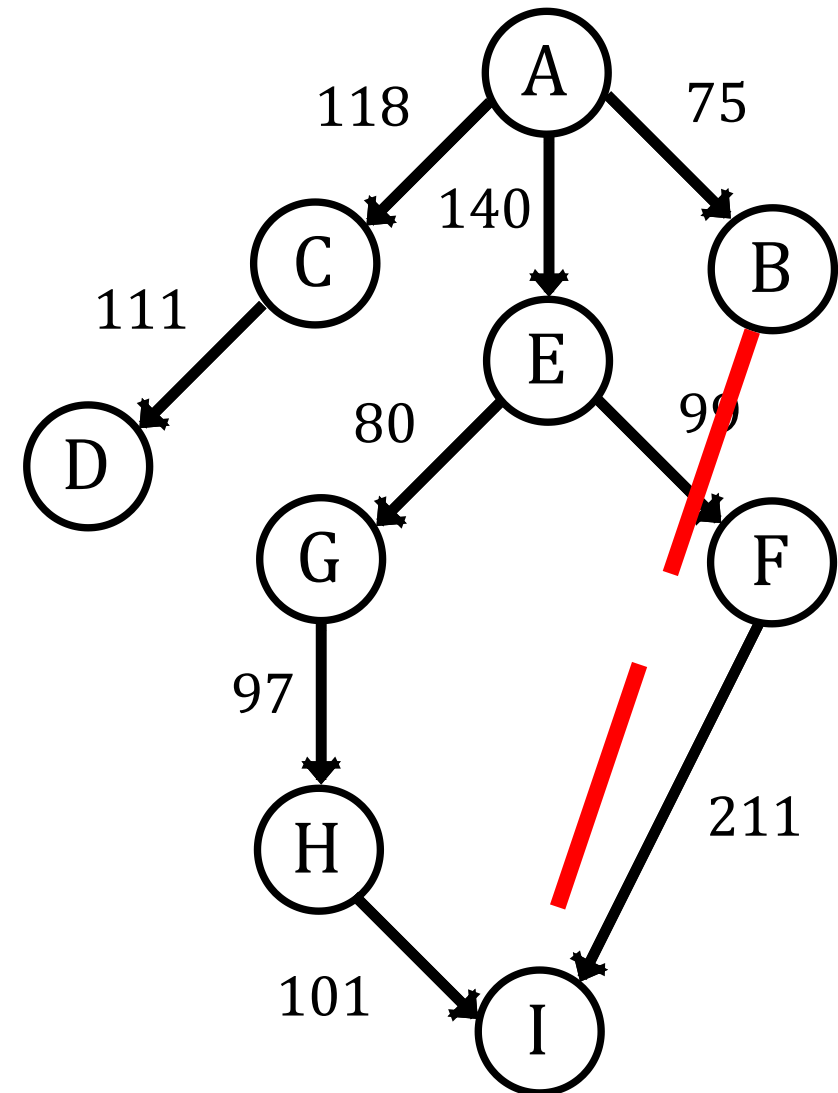
State	Heuristic: $h(n)$
<b>A</b>	<b>366</b>
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

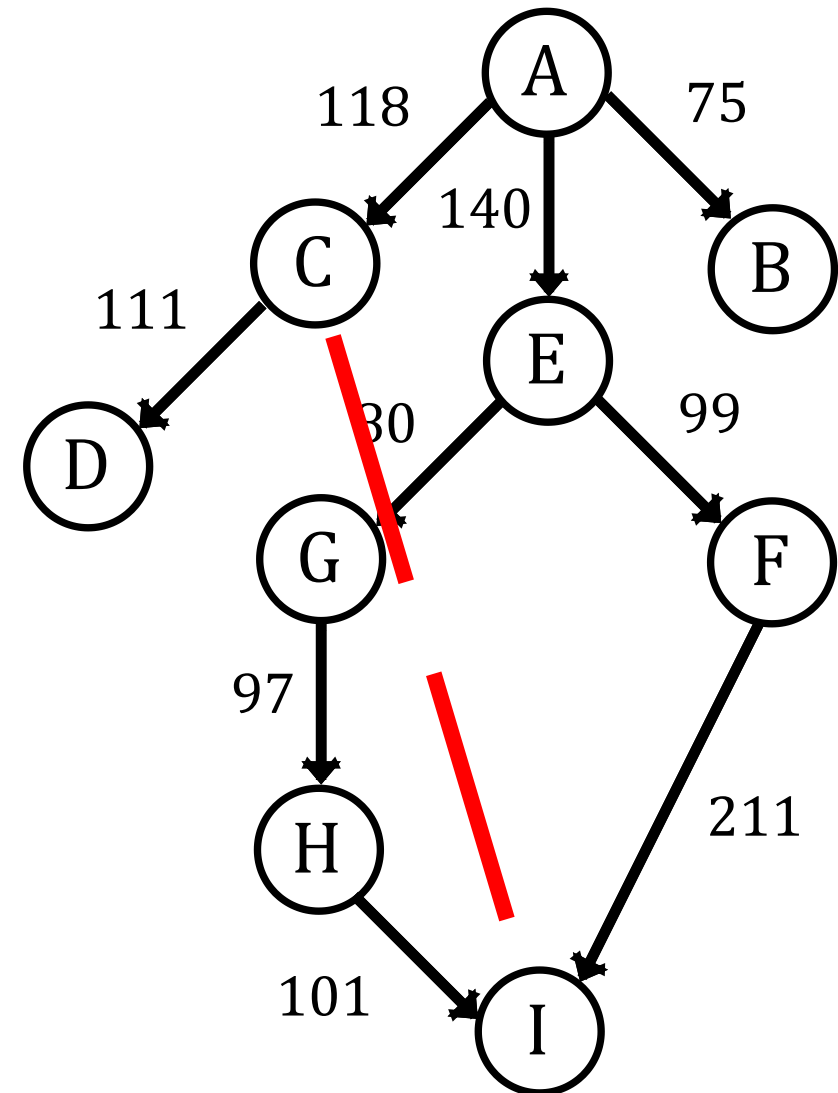
State	Heuristic: $h(n)$
A	366
<b>B</b>	<b>374</b>
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

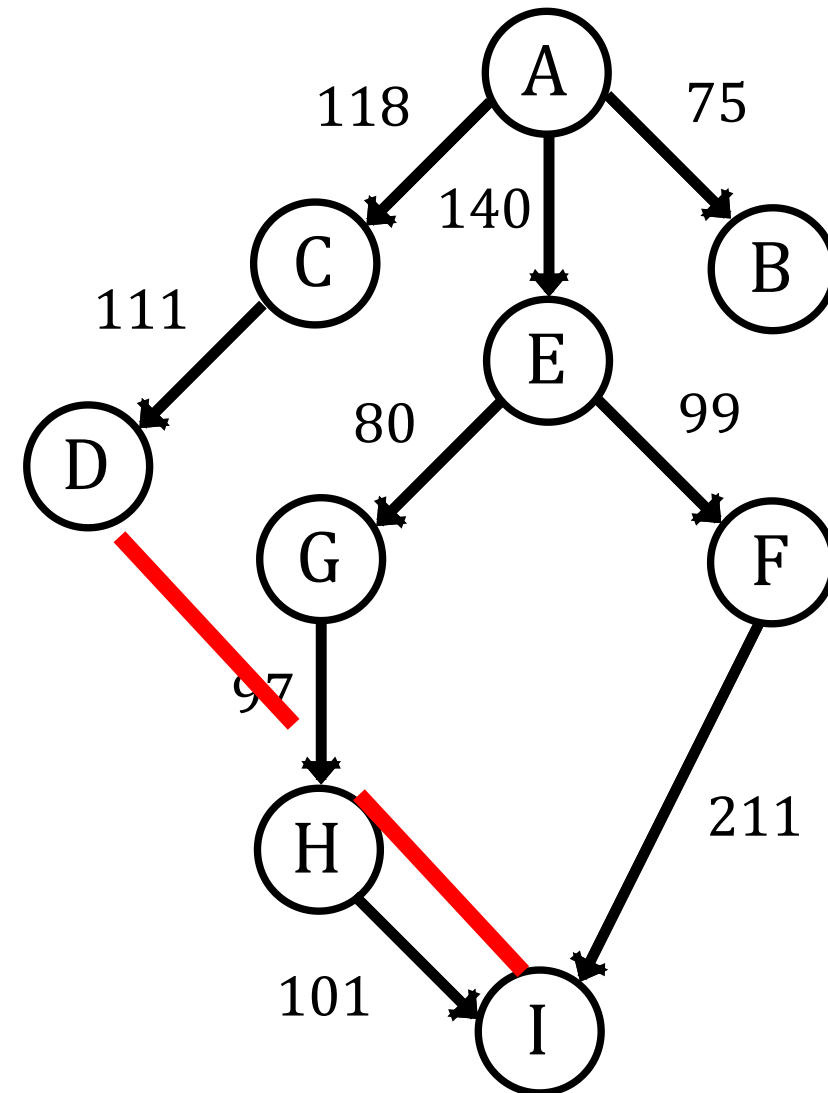
State	Heuristic: $h(n)$
A	366
B	374
<b>C</b>	<b>329</b>
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

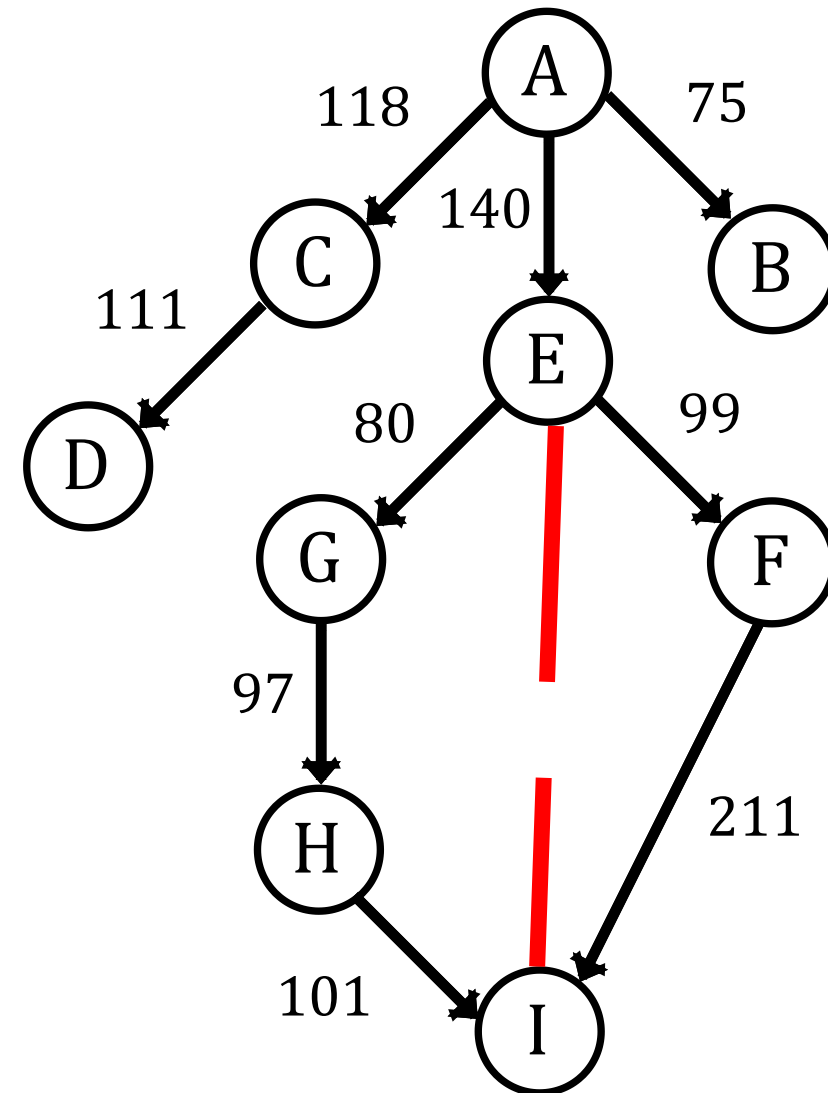
State	Heuristic: $h(n)$
A	366
B	374
C	329
<b>D</b>	<b>244</b>
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

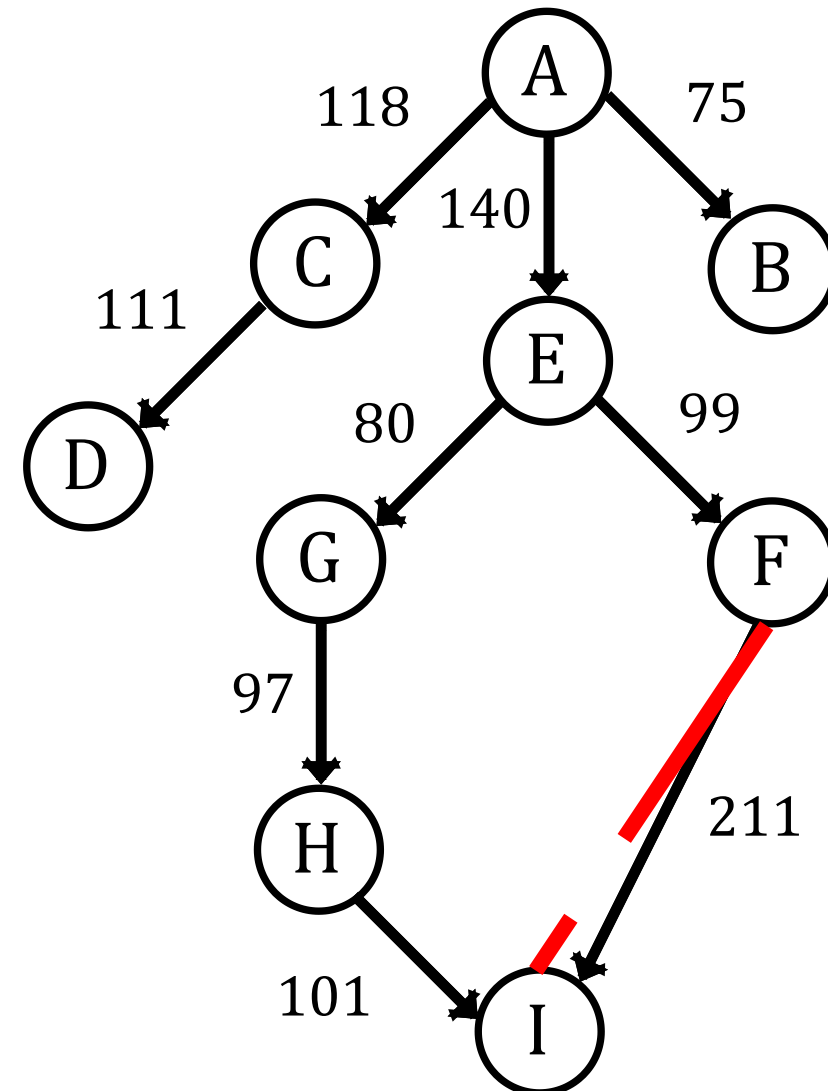
State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
<b>E</b>	<b>253</b>
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

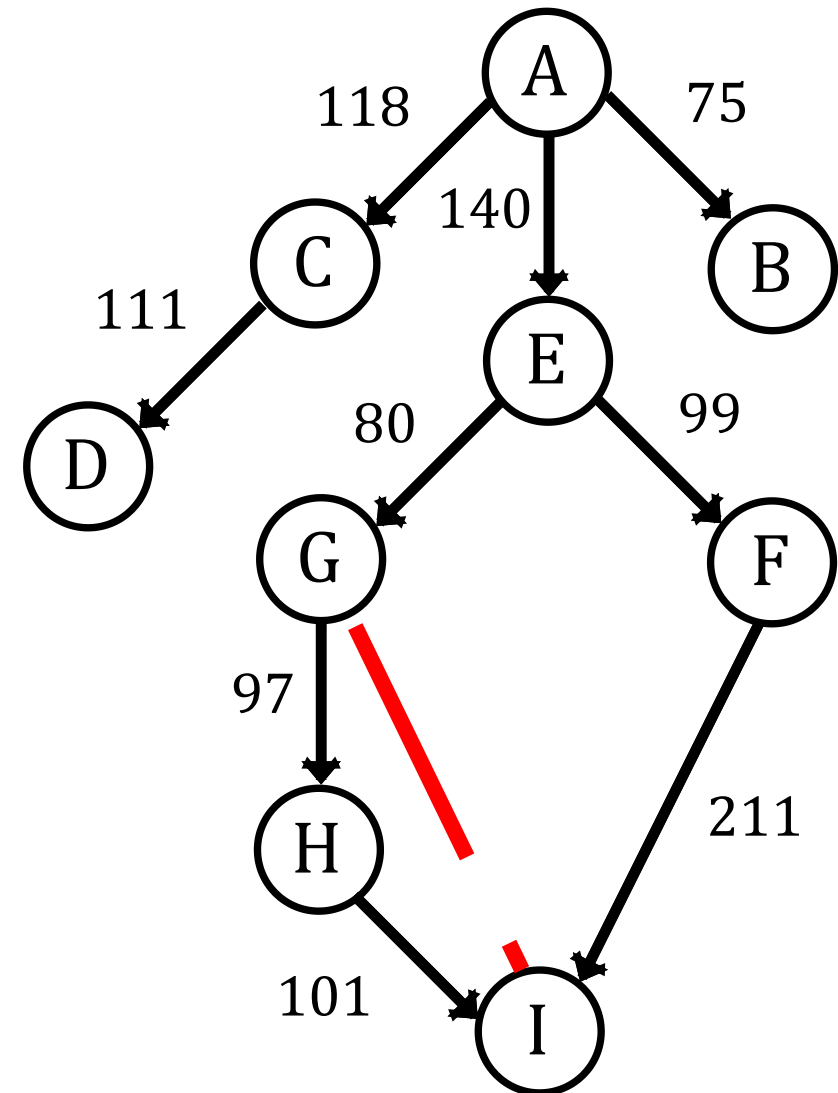
State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
E	253
<b>F</b>	<b>178</b>
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

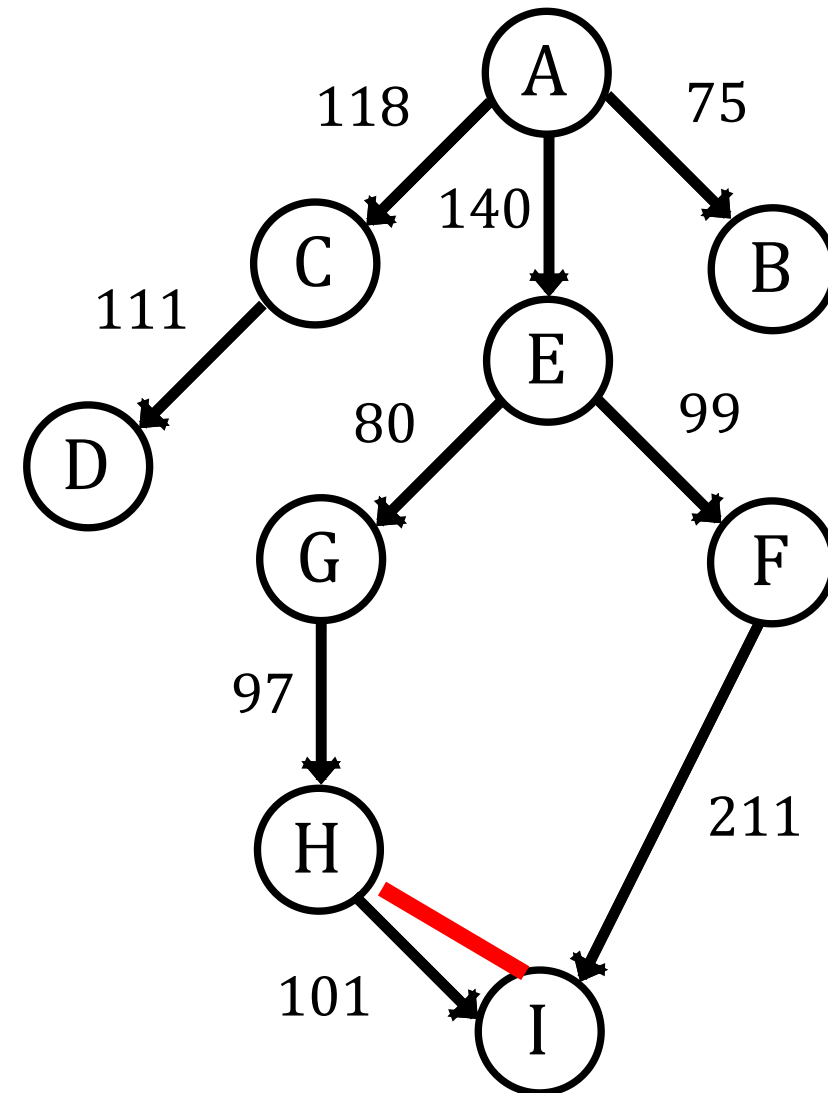
State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
E	253
F	178
<b>G</b>	<b>193</b>
H	98
I	0



# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
E	253
F	178
G	193
<b>H</b>	<b>98</b>
I	0

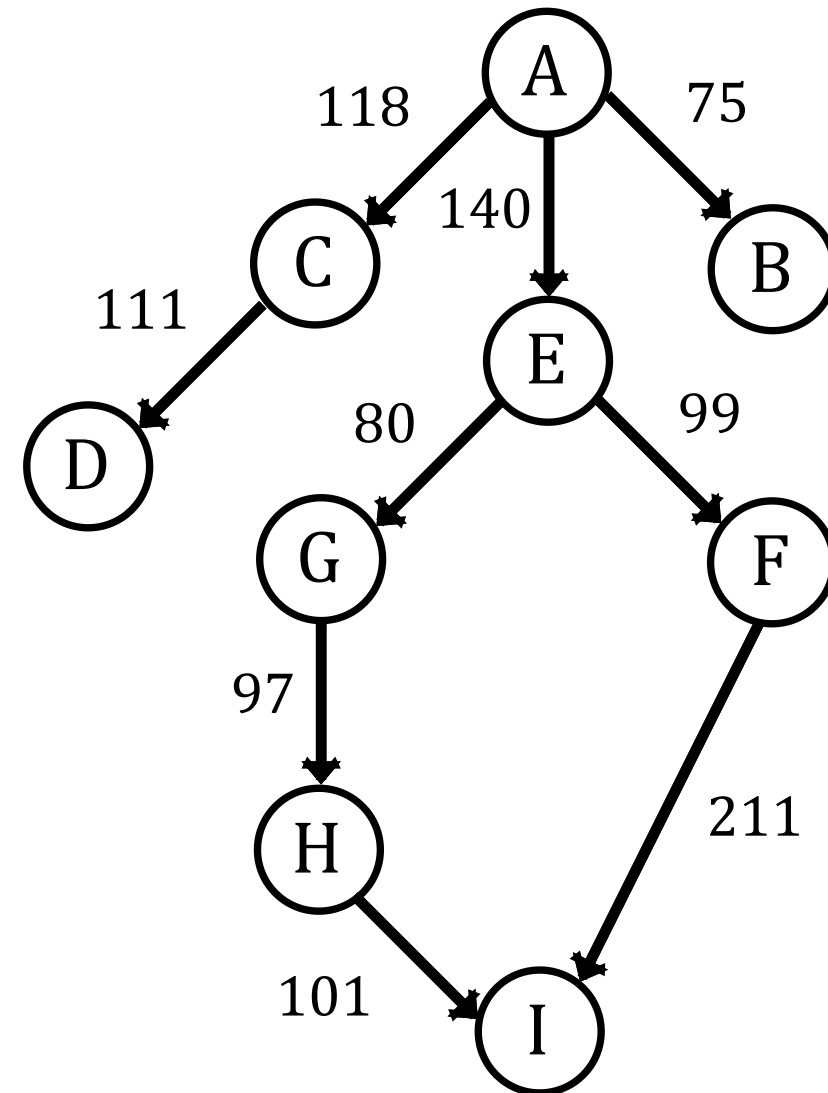




# Greedy Best First Search (Problem 01)

$f(n) = h(n) = \text{Straight Line Distance}$

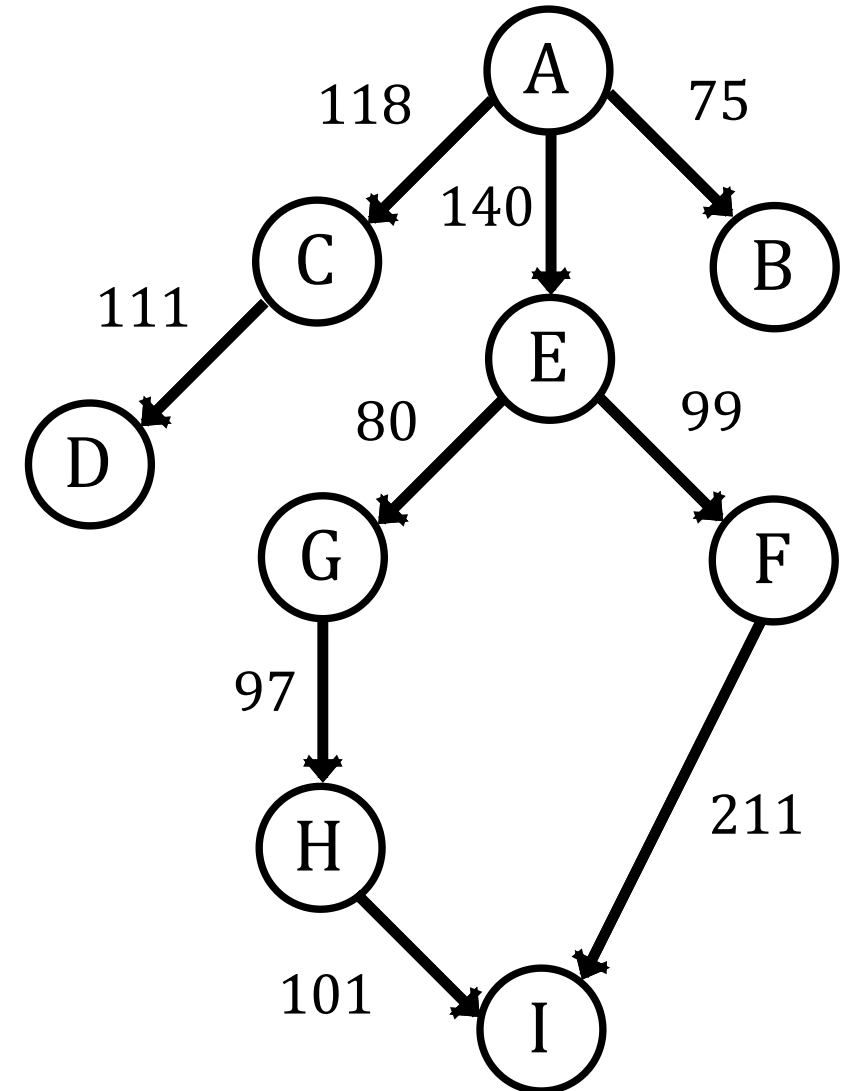
State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
<b>I</b>	<b>0</b>



# Greedy Best First Search (Problem 01)

Queue		
Path	Cost	f(n)

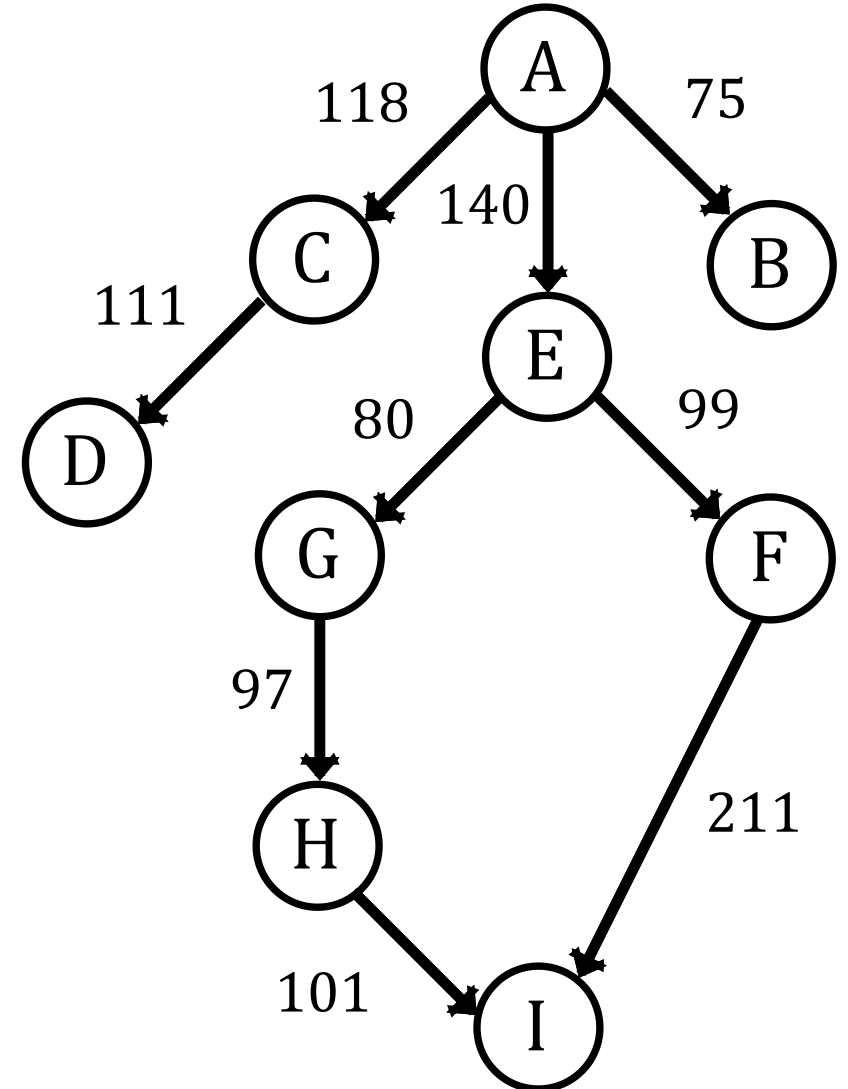
State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

Queue		
Path	Cost	f(n)
<A>	0	366

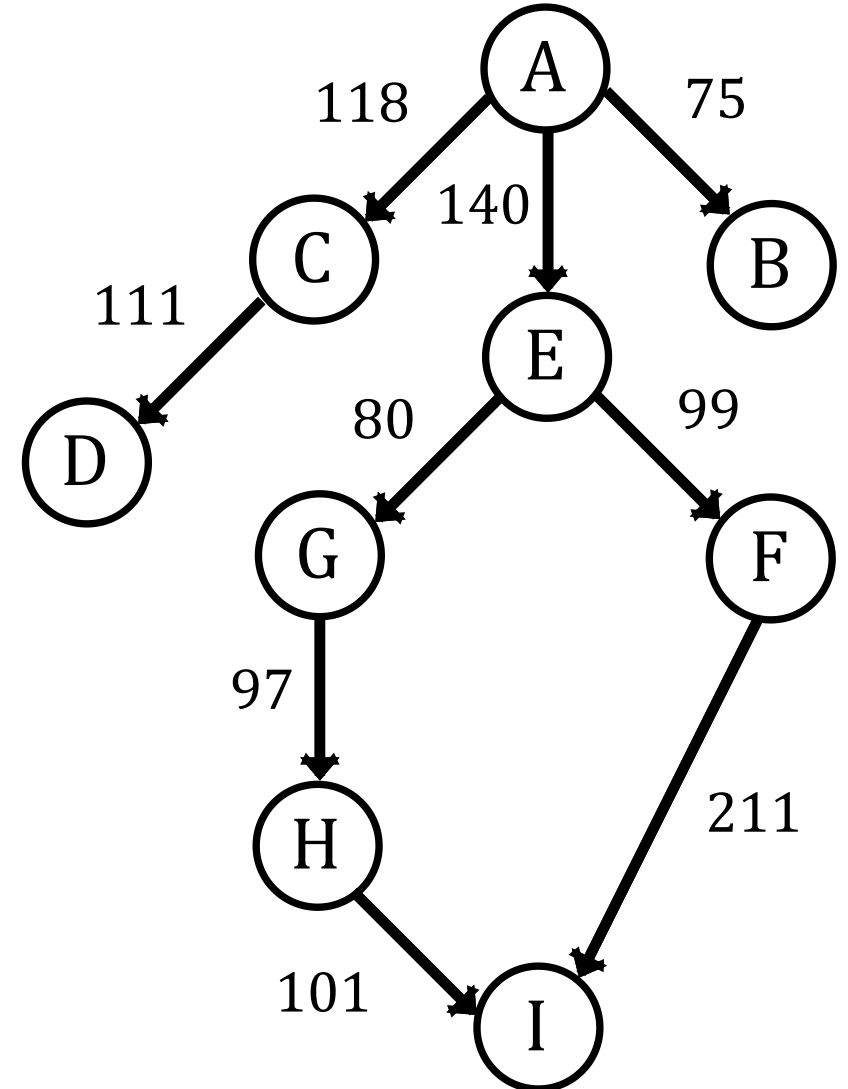
State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

Queue		
Path	Cost	f(n)
<E,A>	140	253
<C,A>	118	329
<B,A>	75	374

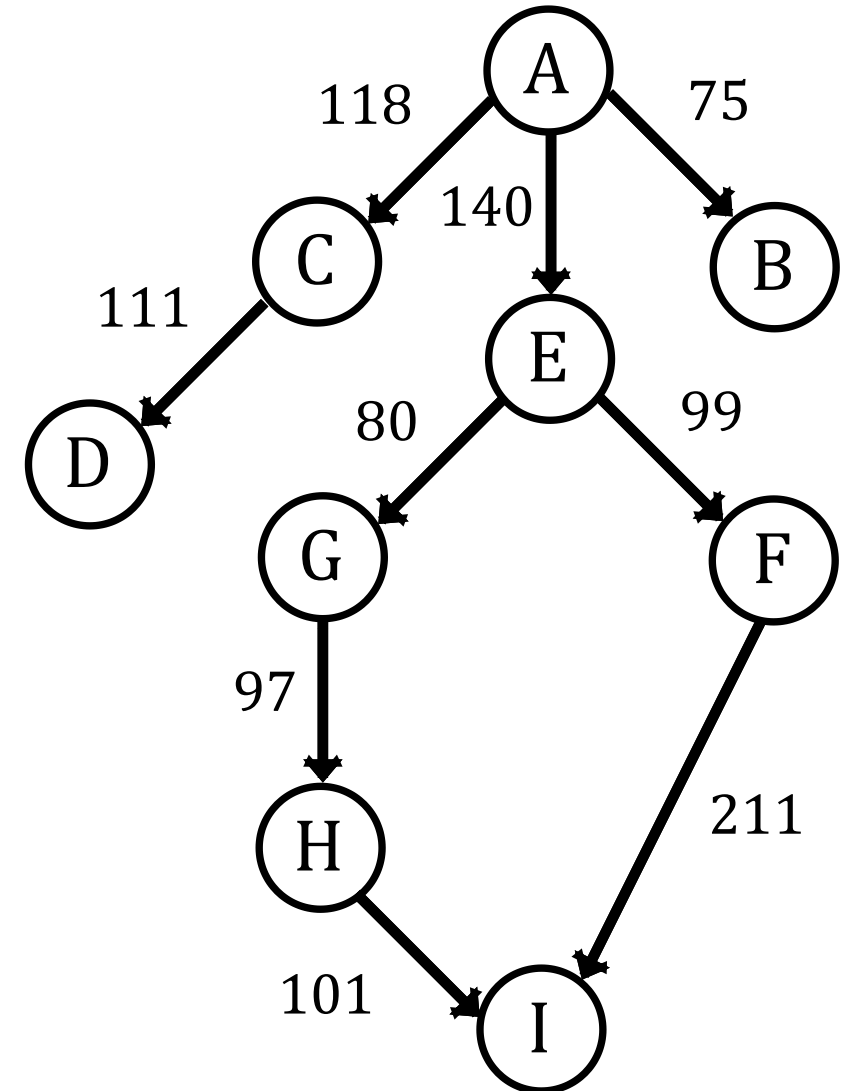
State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

Queue		
Path	Cost	f(n)
<F,E,A>	239	178
<G,E,A>	220	193
<C,A>	118	329
<B,A>	75	374

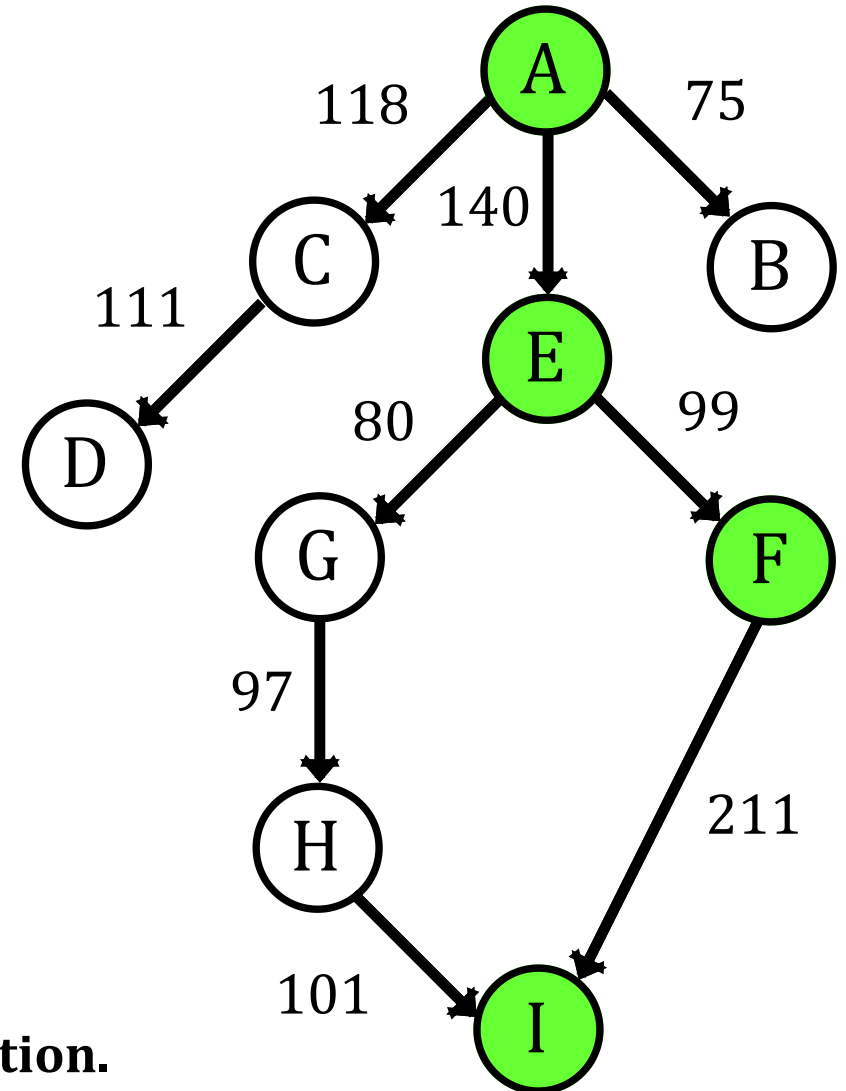
State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# Greedy Best First Search (Problem 01)

Queue		
Path	Cost	f(n)
<I,F,E,A>	450	0
<G,E,A>	220	193
<C,A>	118	329
<B,A>	75	374

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



Solution = A → E → F → I

Path Cost = 140+99+211= 450

As minimum path is the goal path, so we have found a solution.

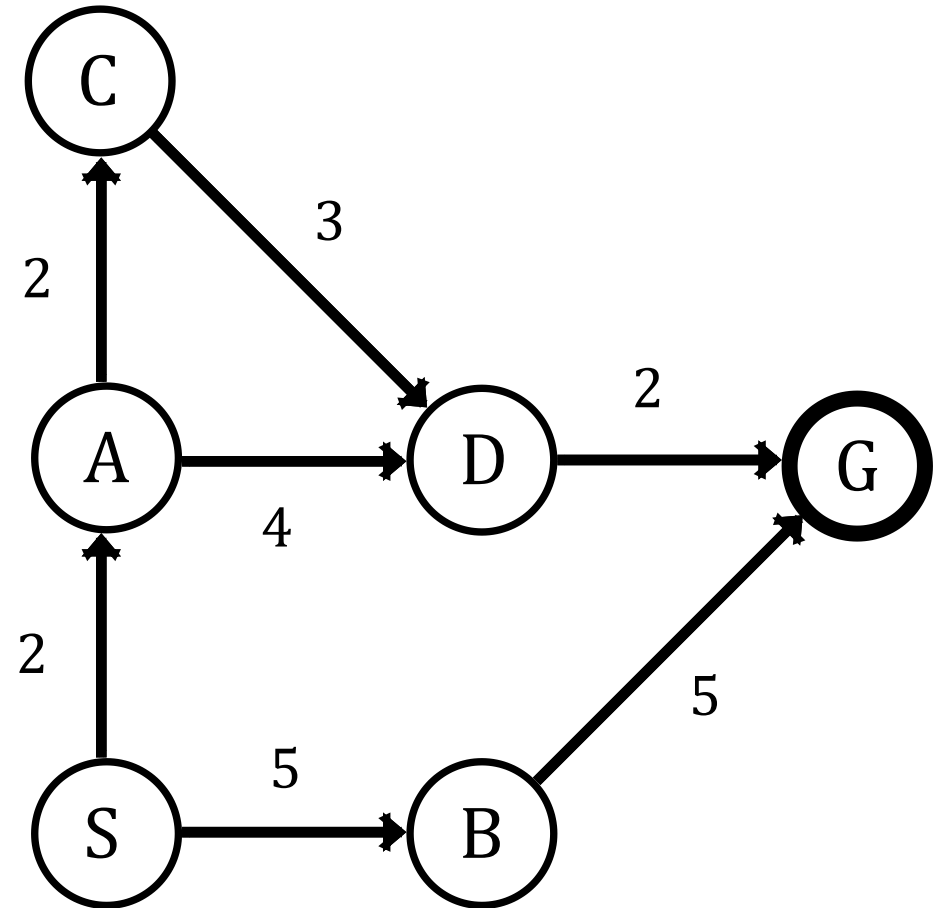
# Greedy Best First Search

- Greedy First Search is not optimal.
- Path 1:  $A \rightarrow E \rightarrow F \rightarrow I$  (Cost =  $140+99+211=450$ )
- Path 2:  $A \rightarrow E \rightarrow G \rightarrow H \rightarrow I$  (Cost =  $140+80+97+101=418$ )
- There was path (i.e. path 2) more optimal than path 1.
- It is faster but not optimal.

# Greedy Best First Search (Problem 02)

■ **S = Initial State**

■ **G = Goal State**

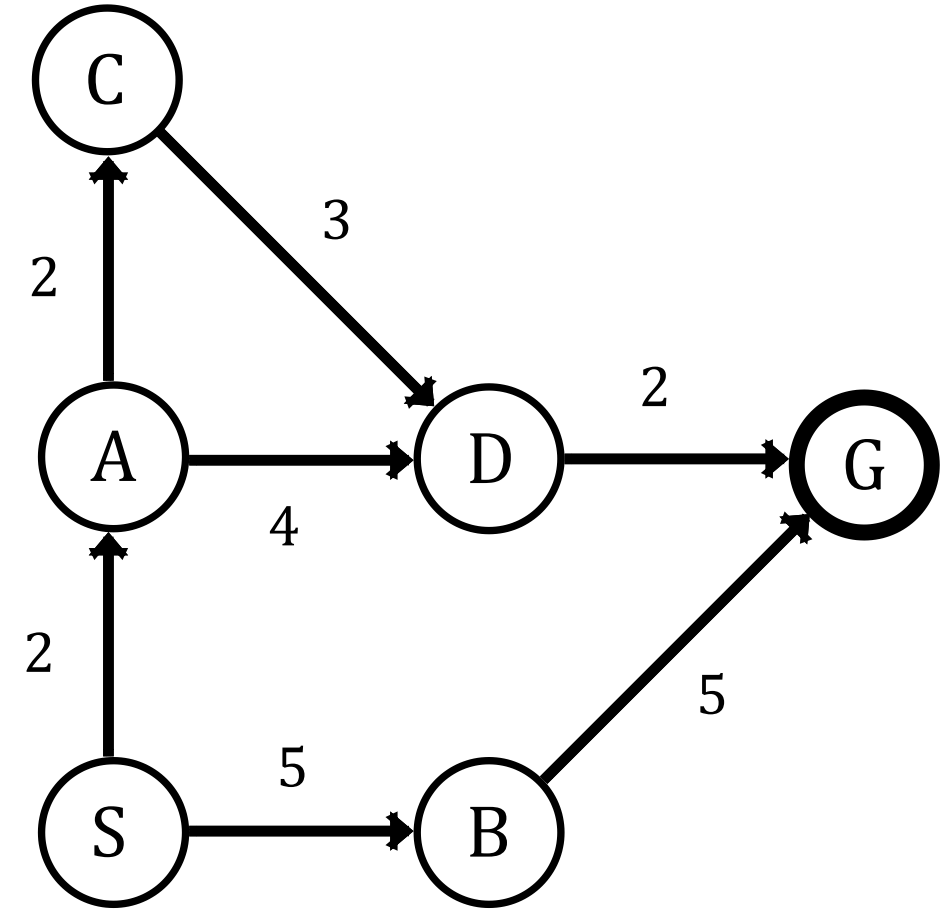




# Greedy Best First Search (Problem 02)

$f(n) = h(n) = \text{Straight Line Distance}$

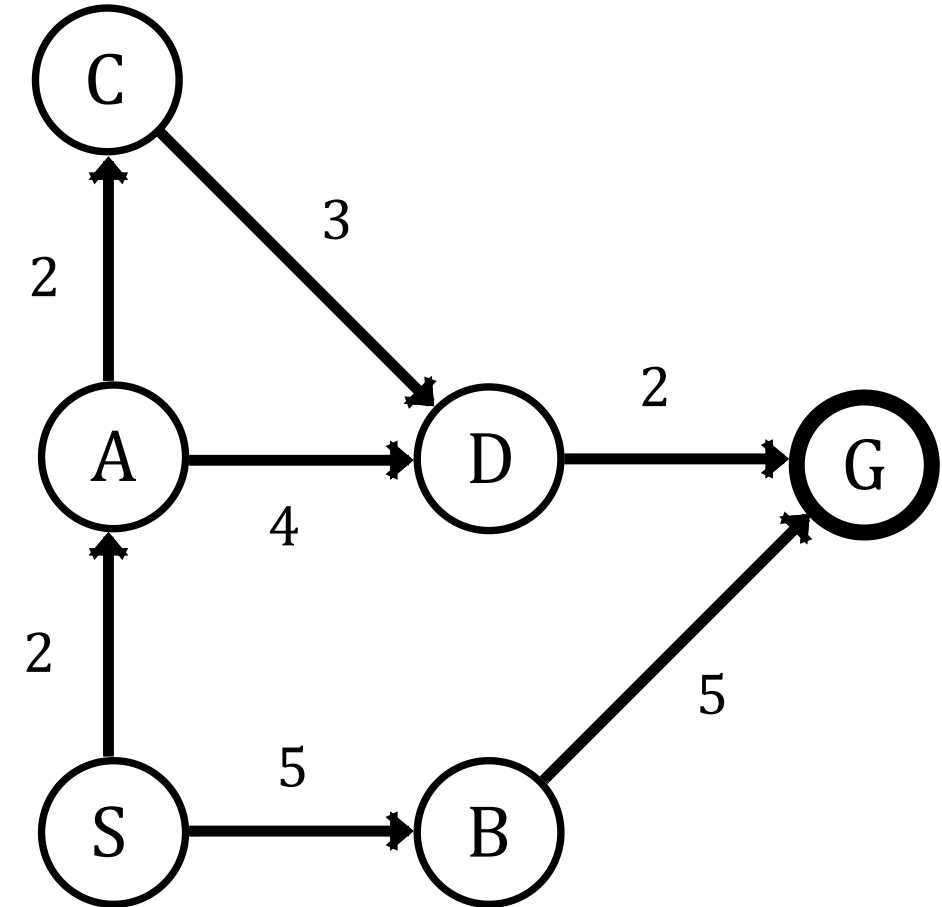
State	Heuristic: $h(n)$
S	10
A	2
B	3
C	1
D	4
G	0



# Greedy Best First Search (Problem 02)

Queue		
Path	Cost	f(n)

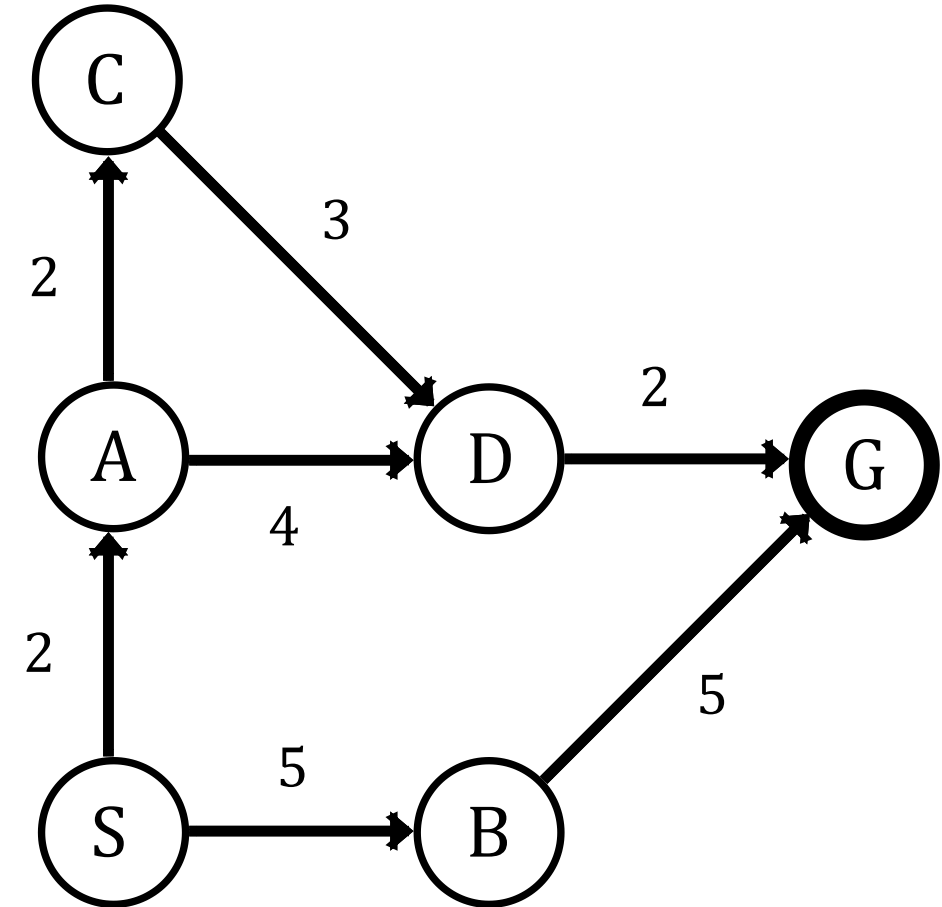
State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



# Greedy Best First Search (Problem 02)

Queue		
Path	Cost	f(n)
<S>	0	10

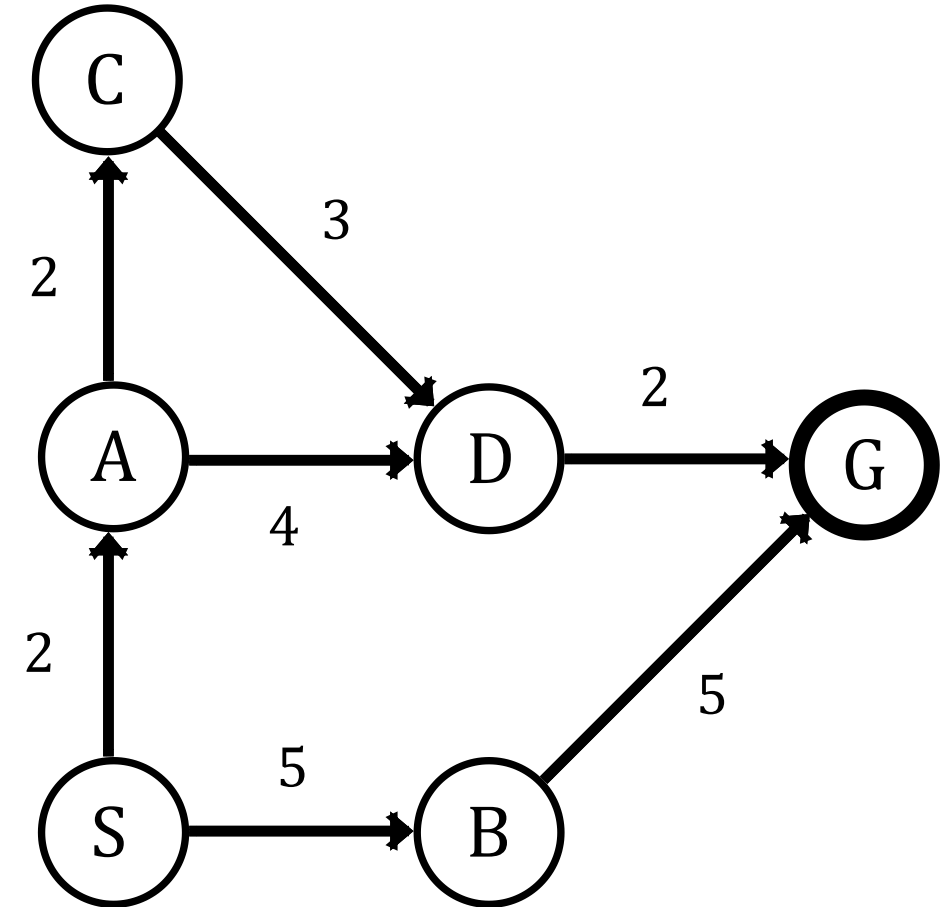
State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



# Greedy Best First Search (Problem 02)

Queue		
Path	Cost	f(n)
<A,S>	2	2
<B,S>	5	3

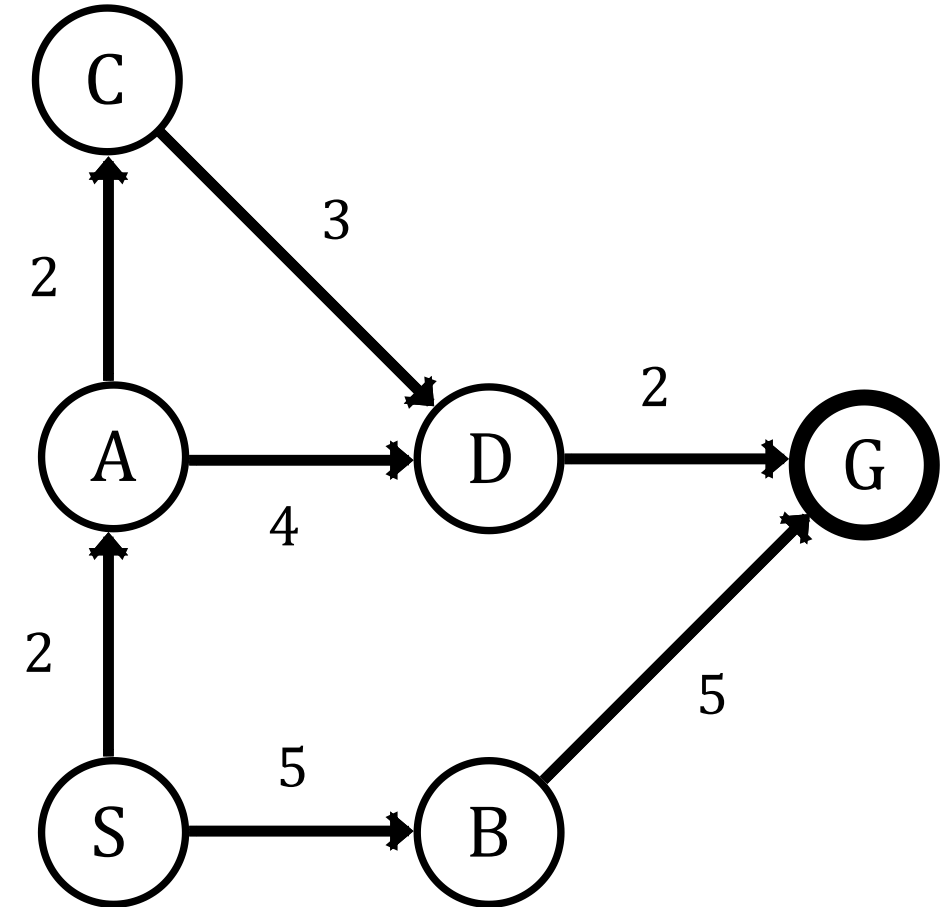
State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



# Greedy Best First Search (Problem 02)

Queue		
Path	Cost	f(n)
<C,A,S>	4	1
<B,S>	5	3
<D,A,S>	6	4

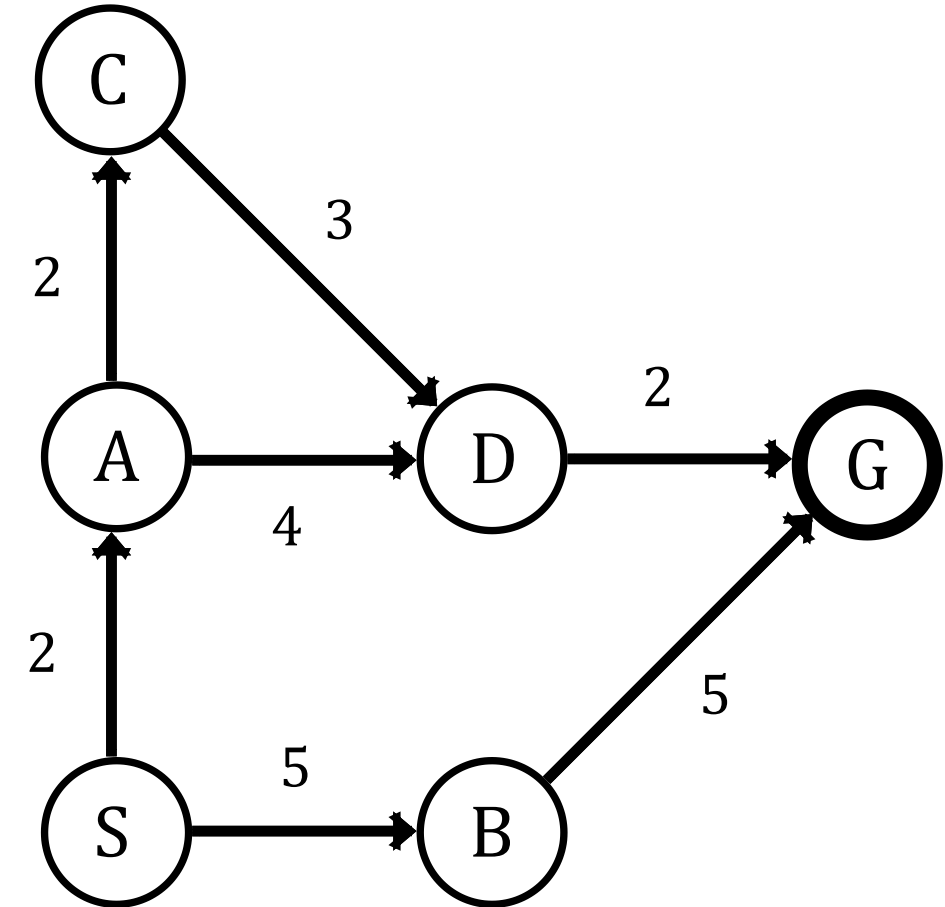
State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



# Greedy Best First Search (Problem 02)

Queue		
Path	Cost	f(n)
<B,S>	5	3
<D,A,S>	6	4
<D,C,A,S>	7	4

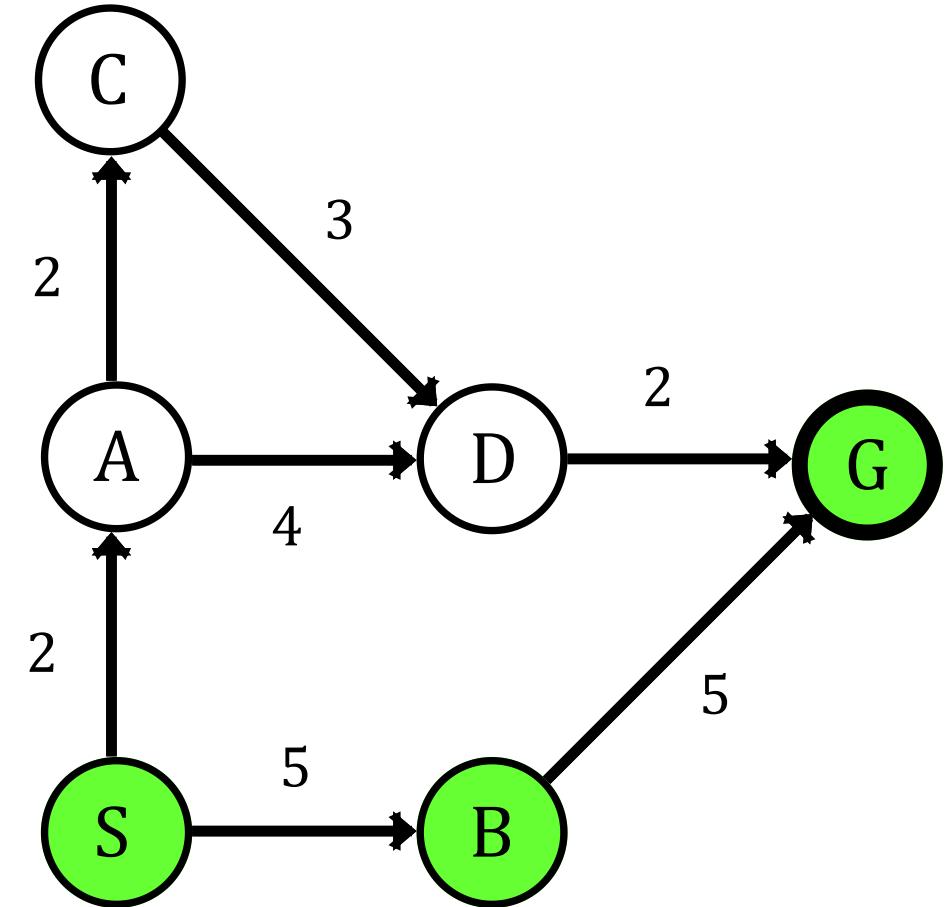
State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



# Greedy Best First Search (Problem 02)

Queue		
Path	Cost	f(n)
<G,B,S>	10	0
<D,A,S>	6	4
<D,C,A,S>	7	4

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



Solution =  $S \rightarrow B \rightarrow G$

Path Cost =  $5+5 = 10$

As minimum path is the goal path, so we have found a solution.

# A\* Search

- Greedy Search minimizes a heuristic  $h(n)$  which is an estimated cost from a node  $n$  to the goal state. However, although greedy search can considerably cut the search time (efficient), it is neither optimal nor complete.
- Uniform Cost Search minimizes the cost  $g(n)$  from the initial state to  $n$ . UCS is optimal and complete but not efficient.
- New Strategy: Combine Greedy Search and UCS to get an efficient algorithm which is complete and optimal.



# A\* Search

- A search algorithm to find the shortest path through a search space to a goal state using a heuristic.

$$f(n) = g(n) + h(n)$$

- $f(n)$  = Function that gives an evaluation of the state.
- $g(n)$  = The cost of getting from the initial state to the current state.
- $h(n)$  = The cost of getting from the current state to a goal state.

# A\* Search

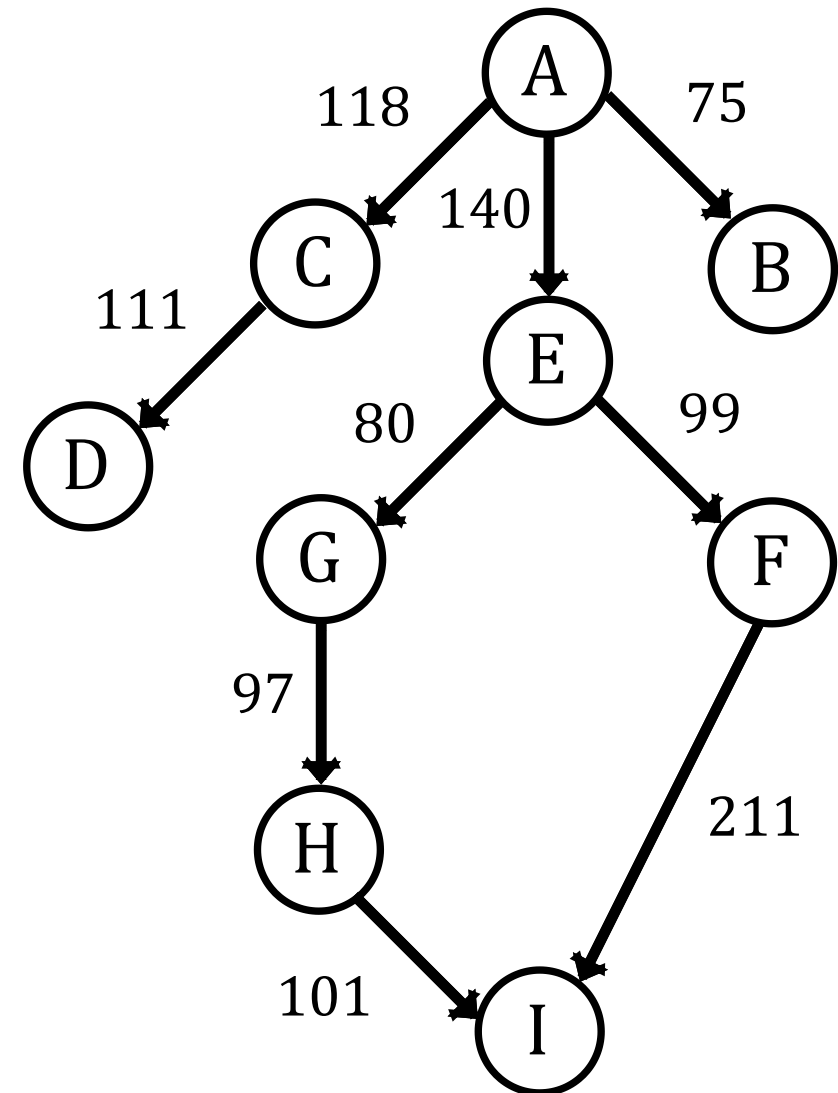
## Algorithm:

- Step 01: Initialize Queue with Starting Node.
- Step 02: Pick the path with minimum heuristic cost  $f(n)=g(n)+h(n)$  from Queue.
- Step 03: If the minimum path is goal, stop algorithm you found the solution.
- Step 04: For each neighbor node  $v$  add expanded path  $\langle v, P \rangle$  to Queue.
- Step 05: Repeat Step 02 to Step 04 until Queue is empty.

# A\* Search (Problem 01)

■ A = Initial State

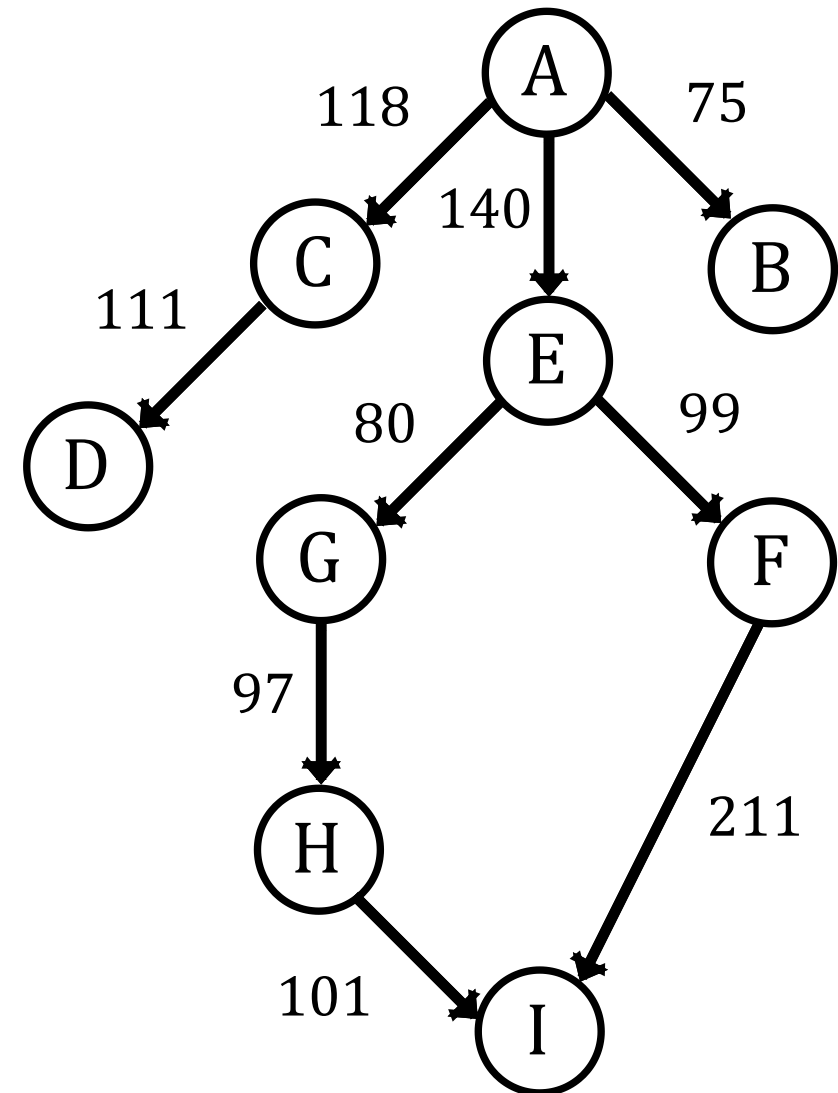
■ I = Goal State



# A\* Search (Problem 01)

**$h(n)$  = Straight Line Distance**

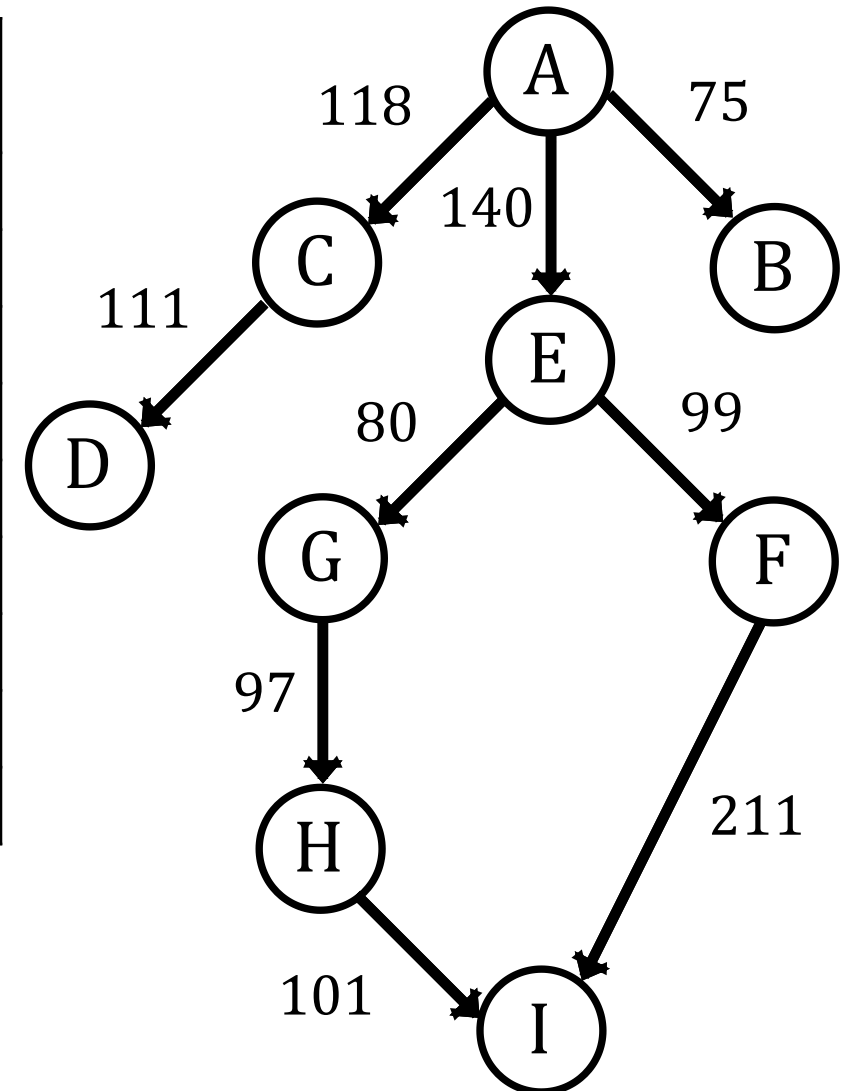
State	Heuristic: $h(n)$
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0

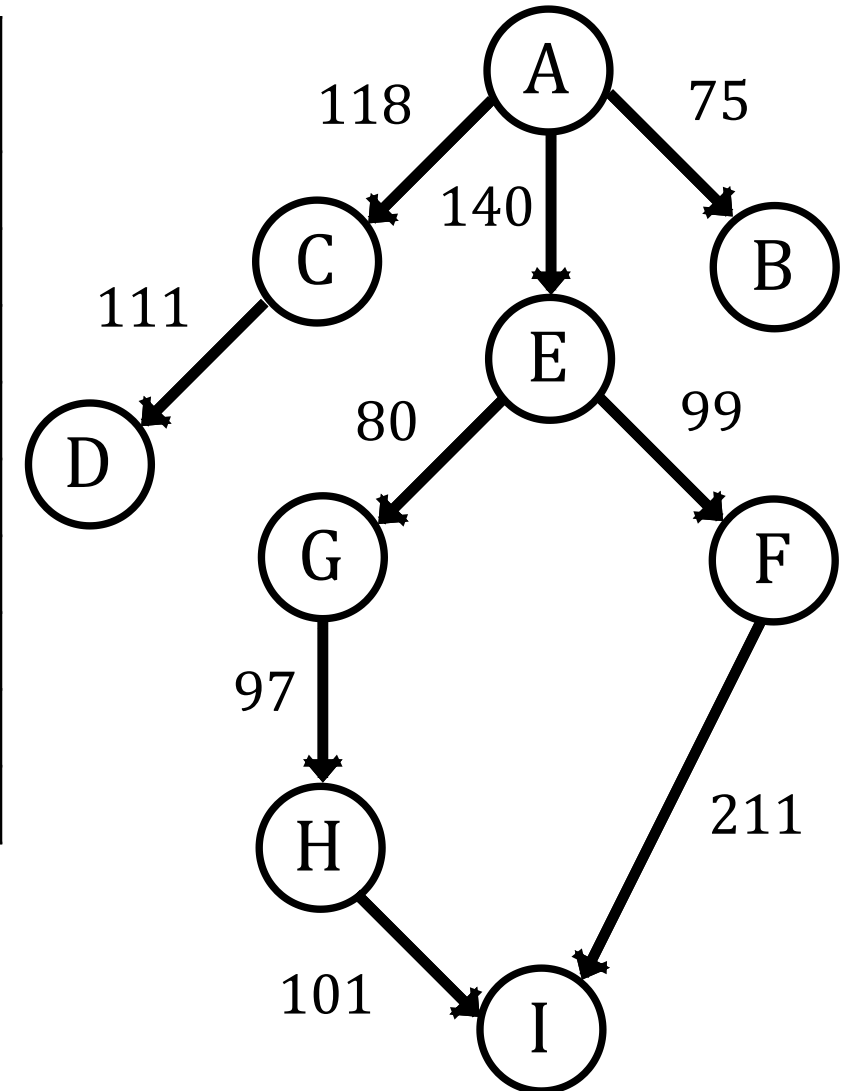


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)
<A>	0	366	366

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0

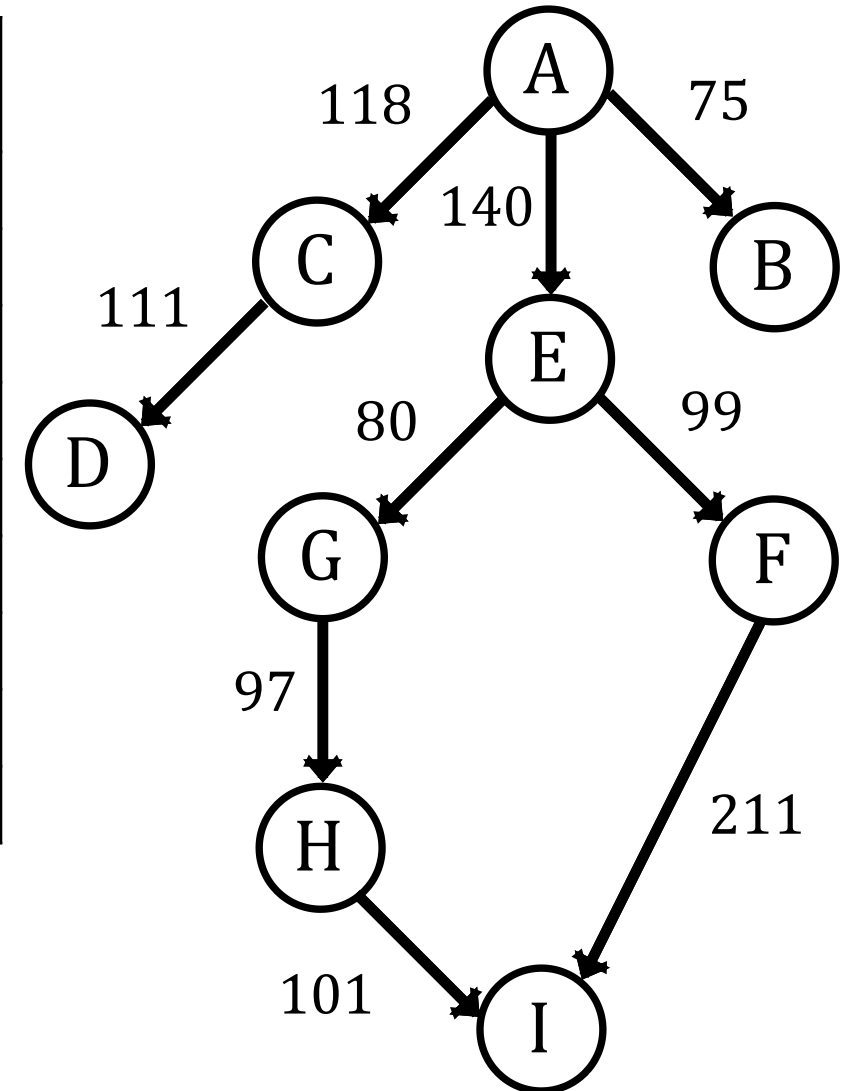


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)
<E,A>	140	253	393
<C,A>	118	329	447
<B,A>	75	374	449

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0

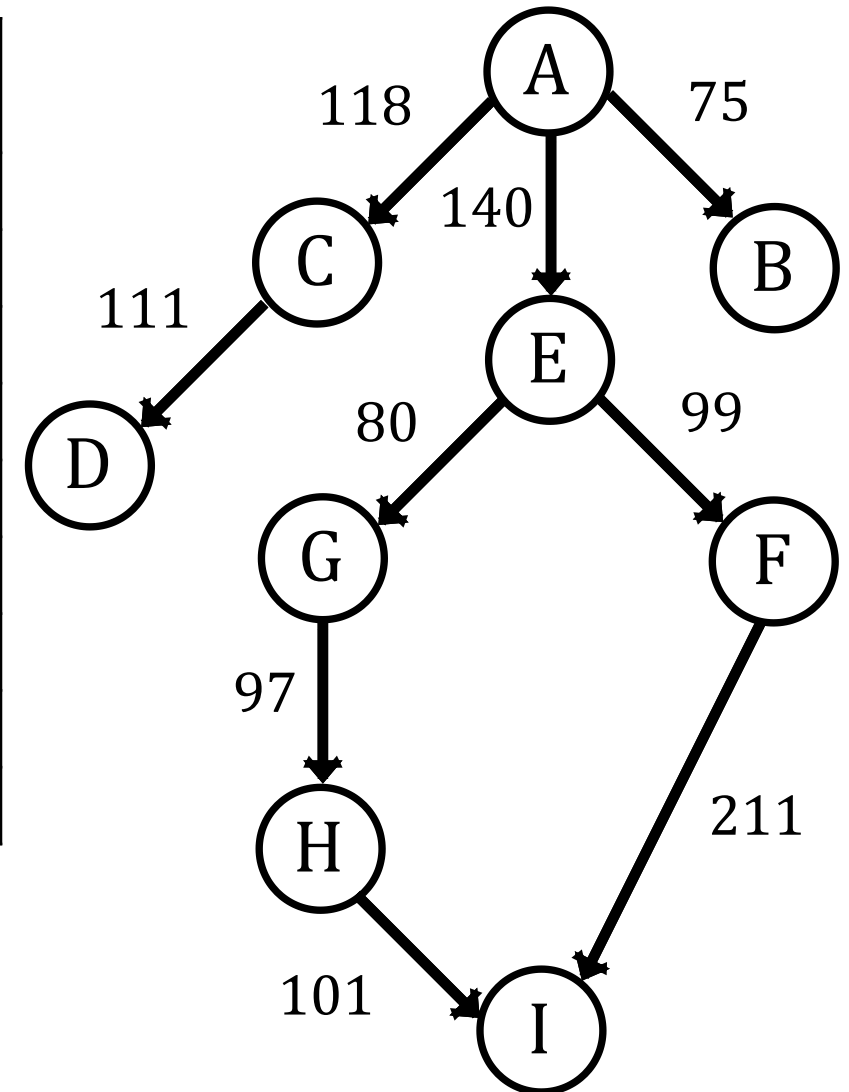


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)
<G,E,A>	220	193	413
<F,E,A>	239	178	417
<C,A>	118	329	447
<B,A>	75	374	449

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



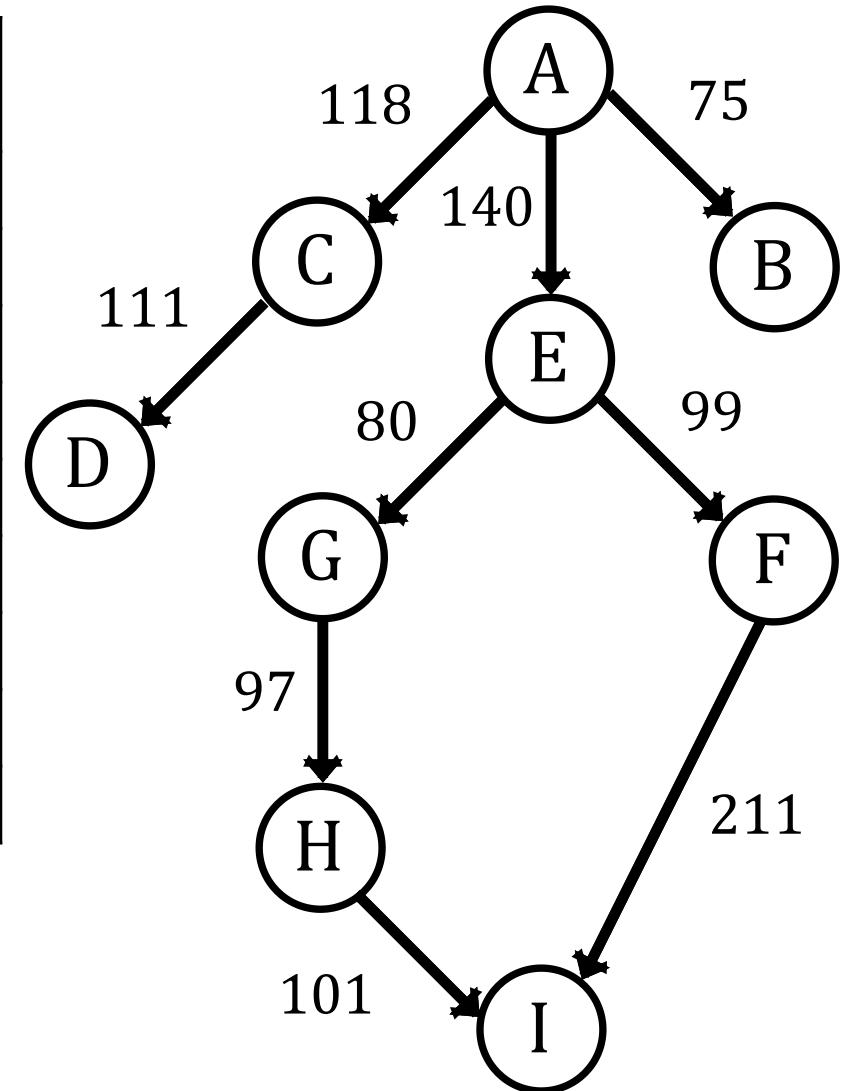
$$f(n) = g(n) + h(n)$$



# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)
<H,G,E,A>	317	98	415
<F,E,A>	239	178	417
<C,A>	118	329	447
<B,A>	75	374	449

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0

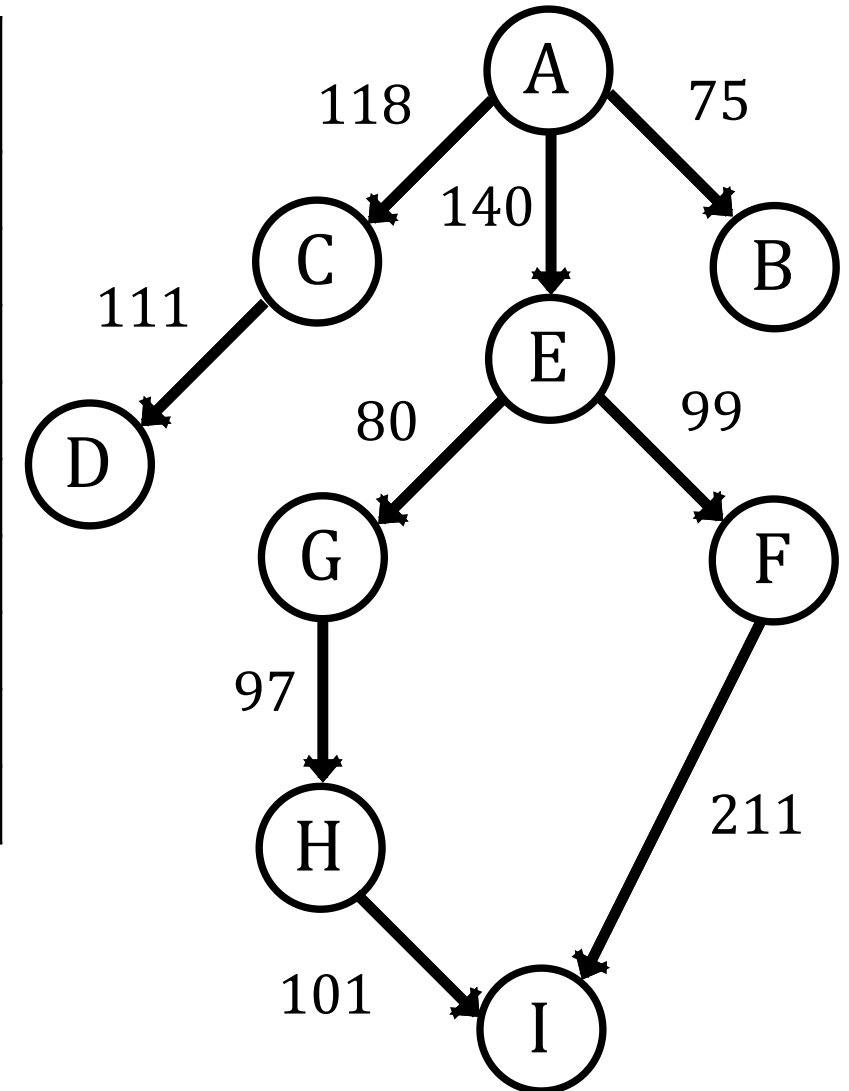


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)
<F,E,A>	239	178	417
<I,H,G,E,A>	418	0	418
<C,A>	118	329	447
<B,A>	75	374	449

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0

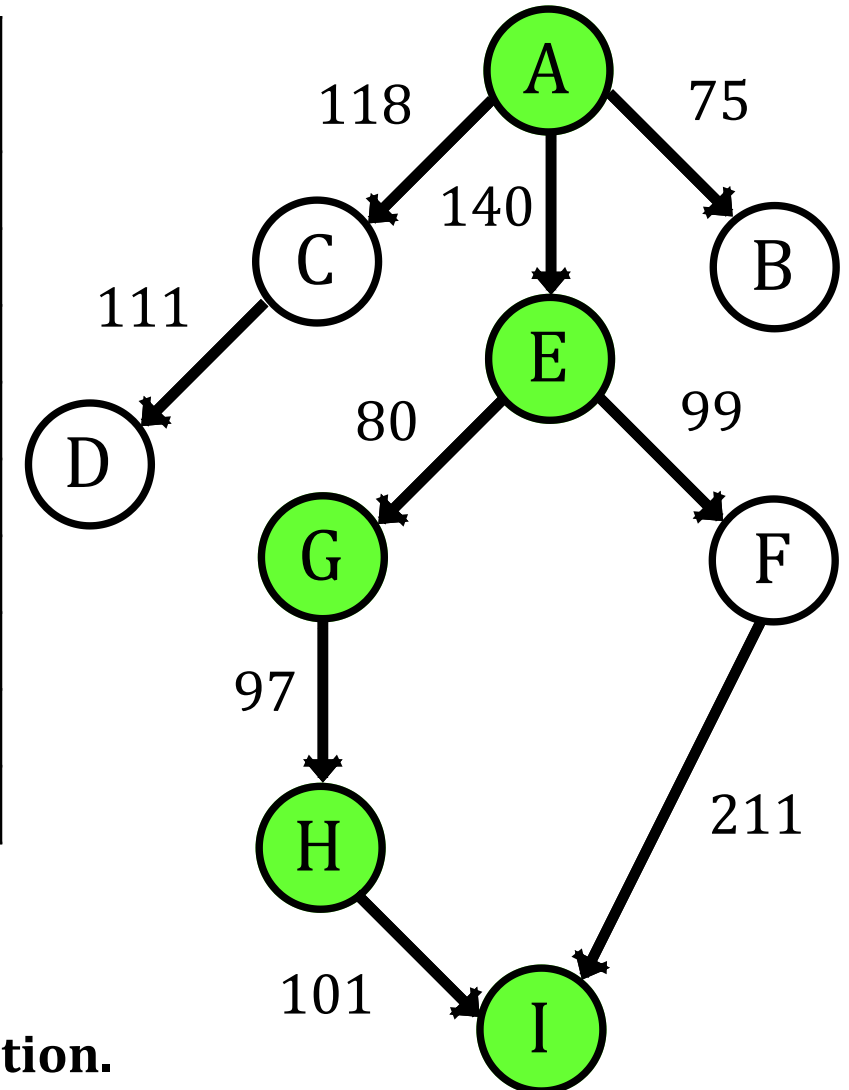


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 01)

Queue			
Path	g(n)	h(n)	f(n)
<I,H,G,E,A>	418	0	418
<C,A>	118	329	447
<B,A>	75	374	449
<I,F,E,A>	239	0	450

State	Heuristic: h(n)
A	366
B	374
C	329
D	244
E	253
F	178
G	193
H	98
I	0



Solution = A → E → G → H → I

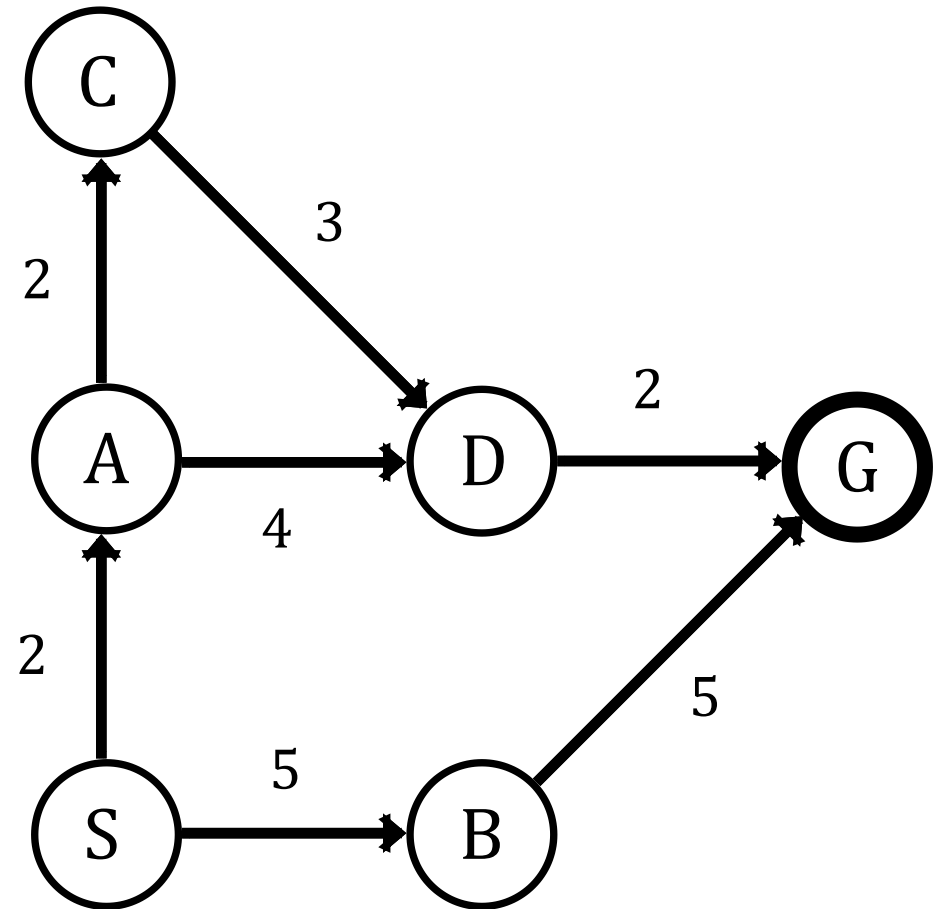
Path Cost = 140+80+97+101 = 418

As minimum path is the goal path, so we have found a solution.

# A\* Search (Problem 02)

■ **S = Initial State**

■ **G = Goal State**

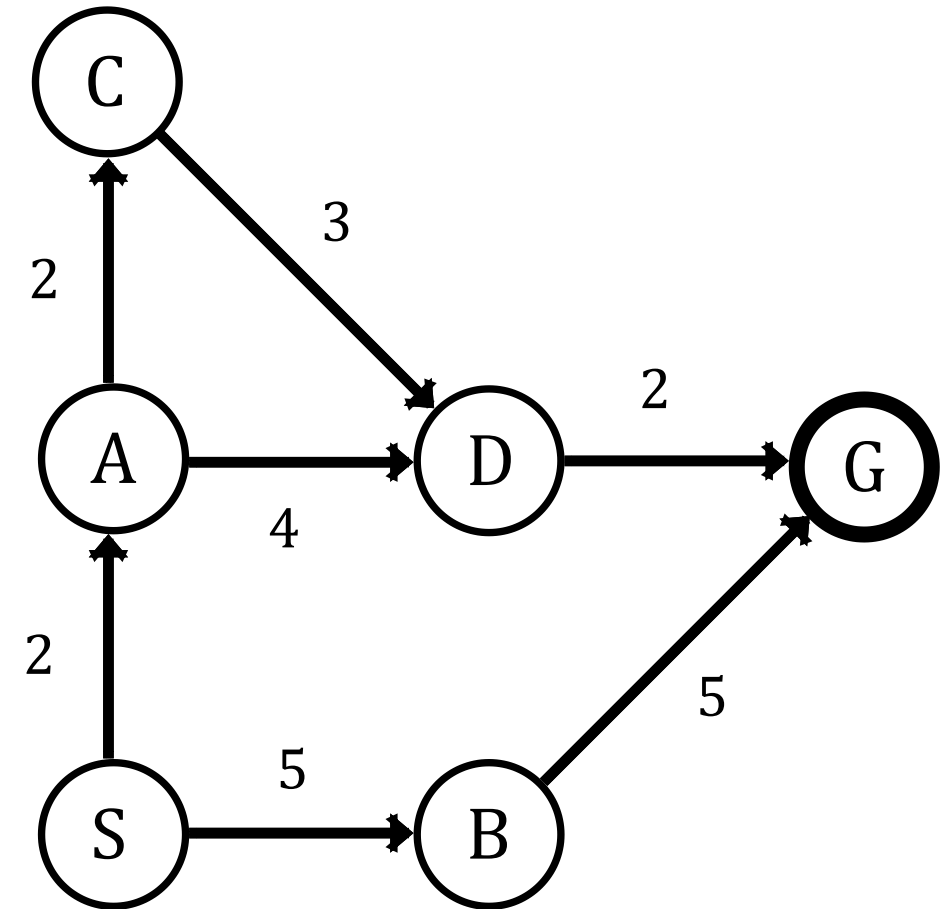


# A\* Search (Problem 02)

$f(n) = h(n) = \text{Straight Line Distance}$

State	Heuristic: $h(n)$
S	10
A	2
B	3
C	1
D	4
G	0

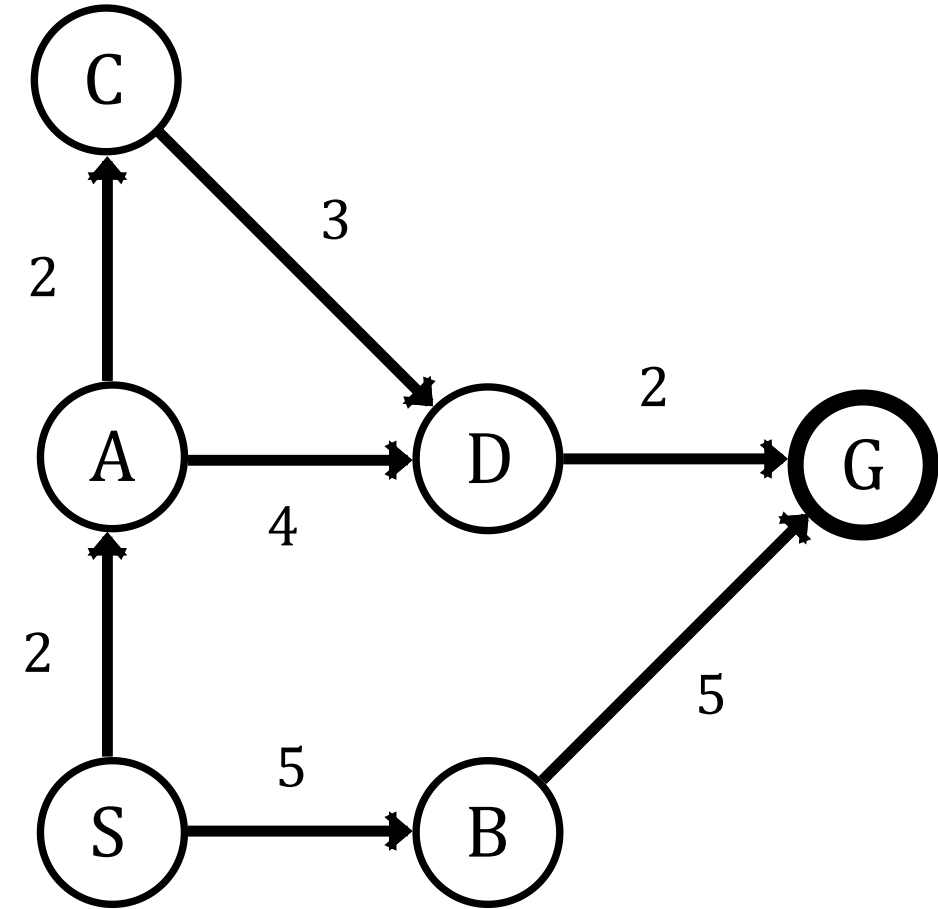
$$f(n) = g(n) + h(n)$$



# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0

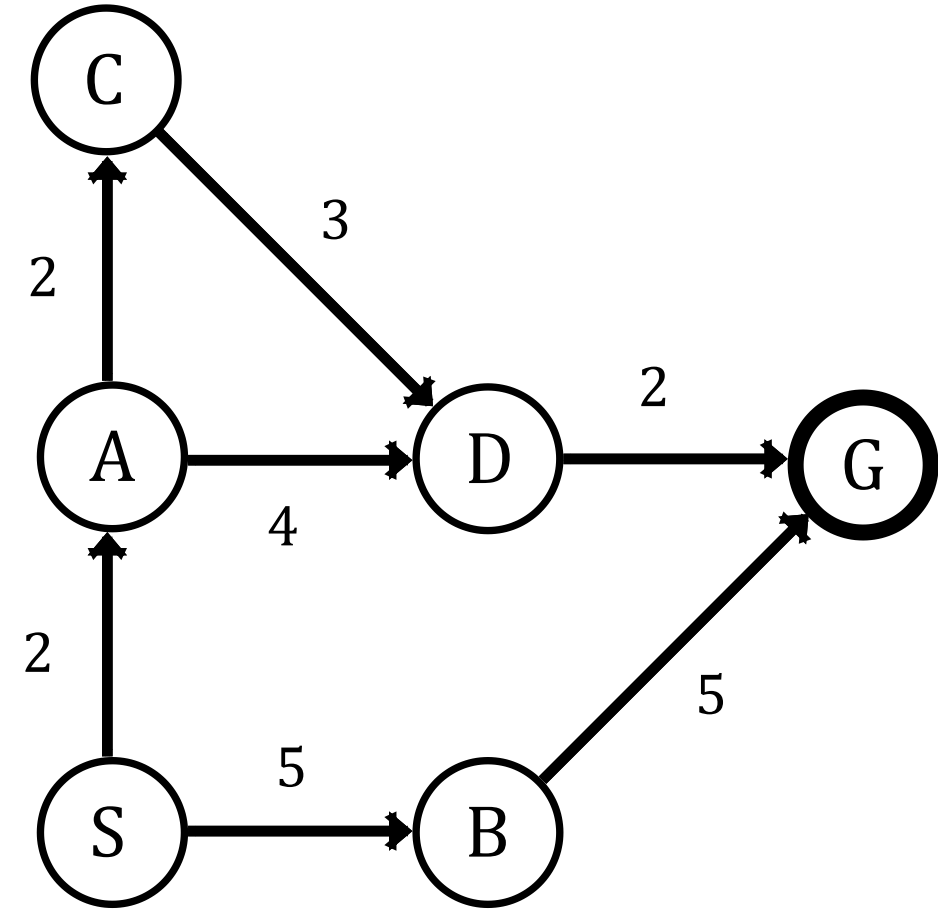


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)
<S>	0	10	10

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0

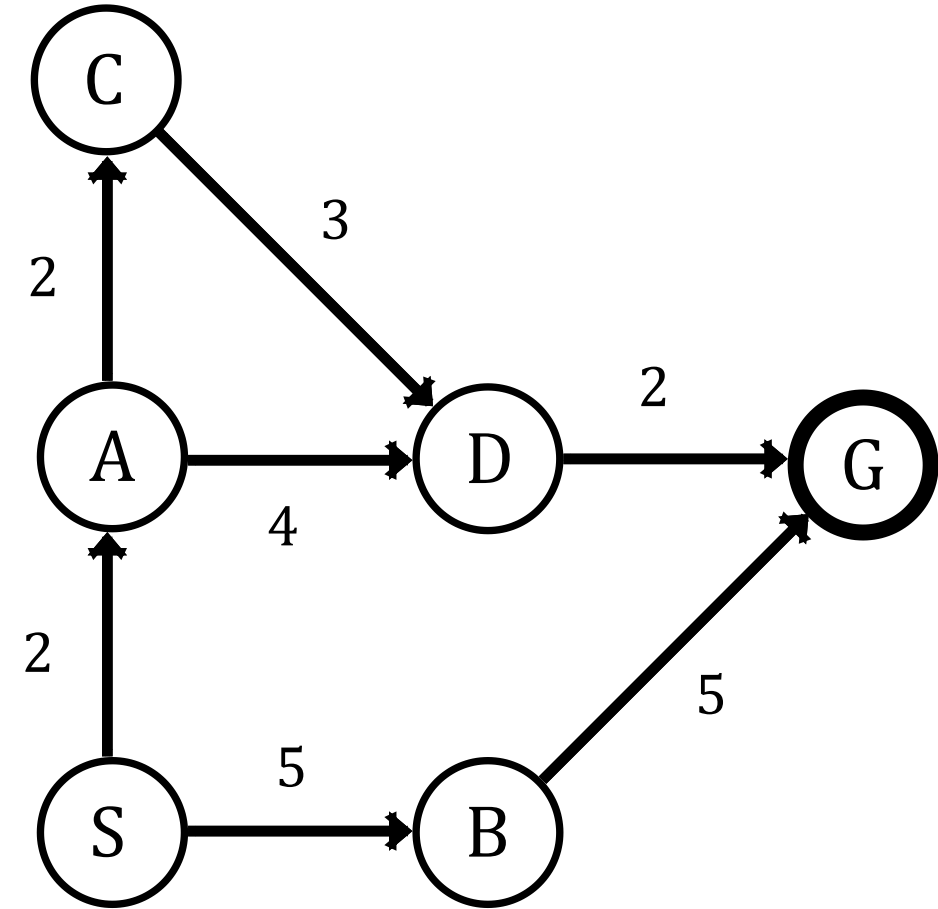


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)
<A,S>	2	2	4
<B,S>	5	3	8

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



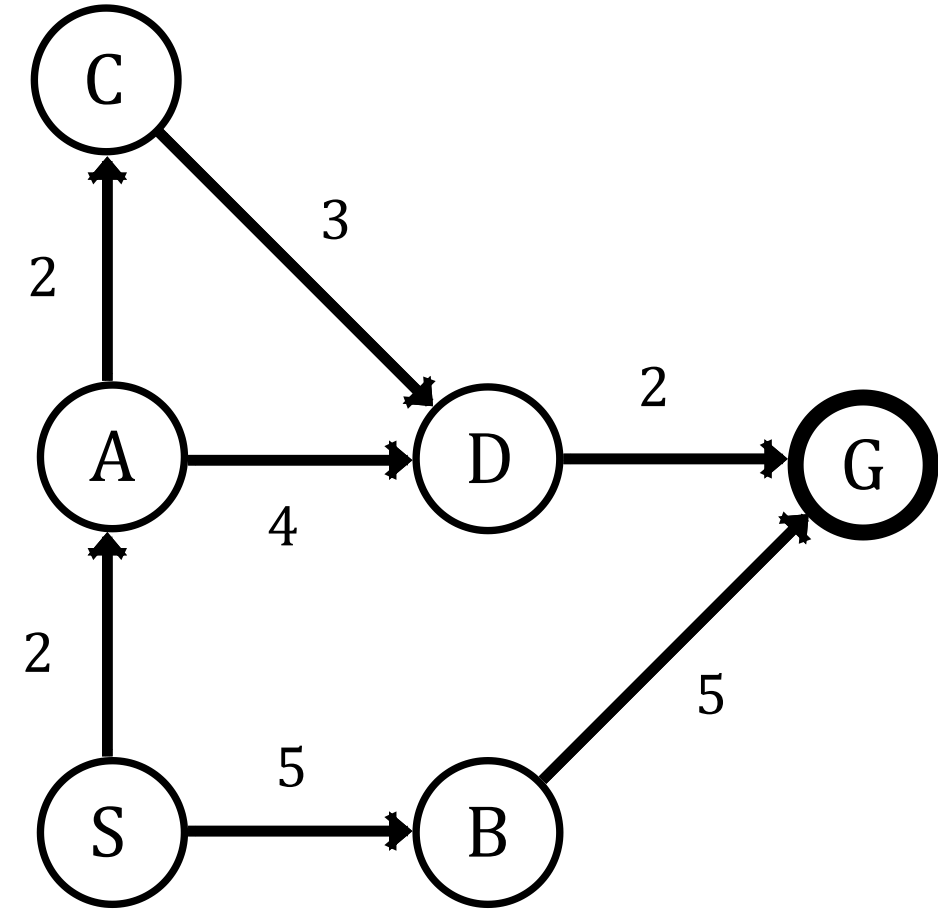
$$f(n) = g(n) + h(n)$$



# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)
<C,A,S>	4	1	5
<B,S>	5	3	8
<D,A,S>	6	4	10

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0

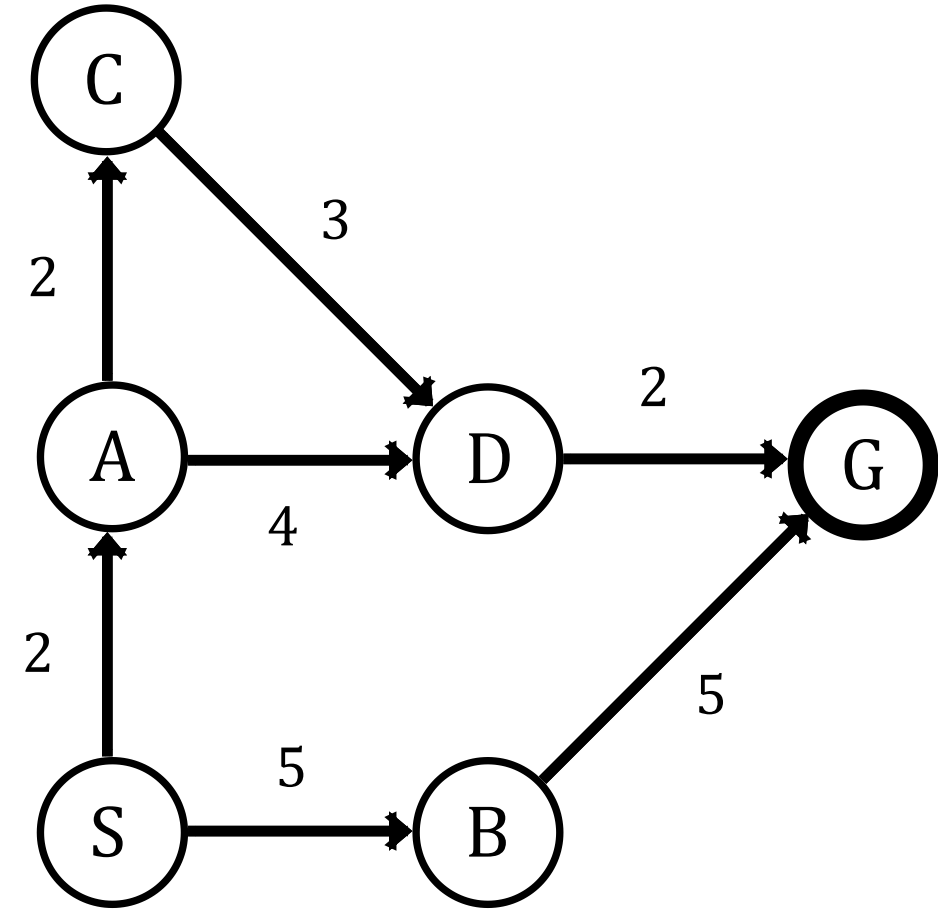


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)
<B,S>	5	3	8
<D,A,S>	6	4	10
<D,C,A,S>	7	4	11

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0

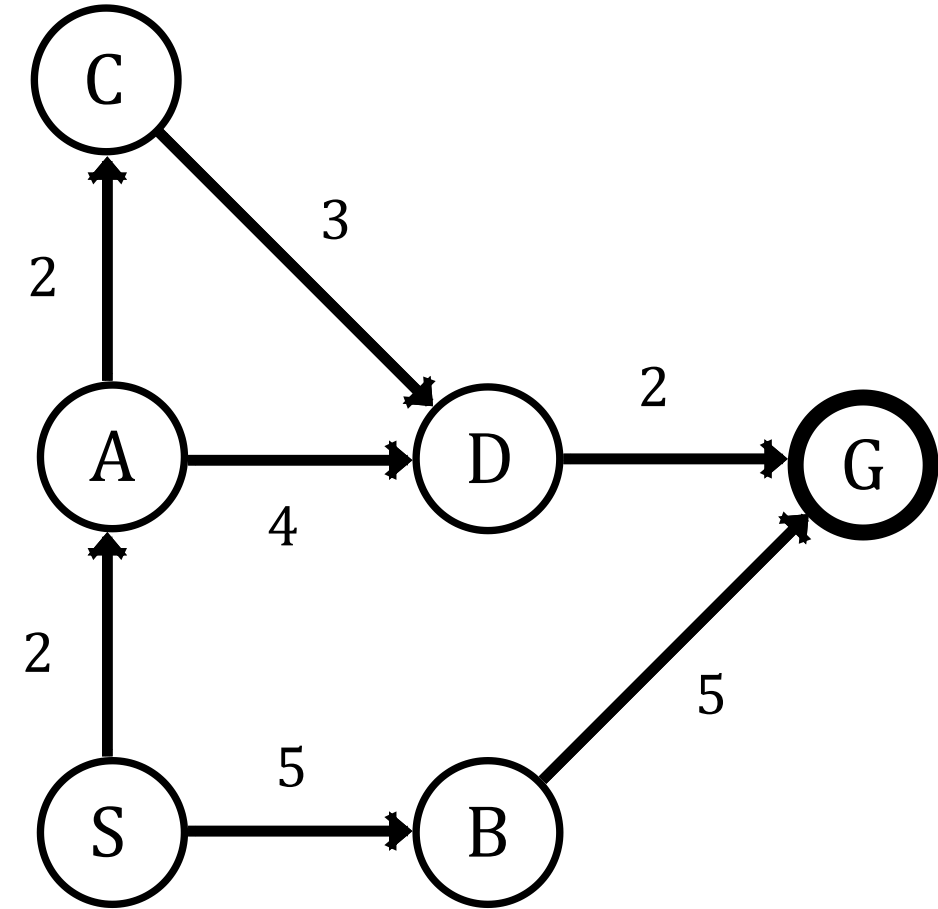


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)
<D,A,S>	6	4	10
<G,B,S>	10	0	10
<D,C,A,S>	7	4	11

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0

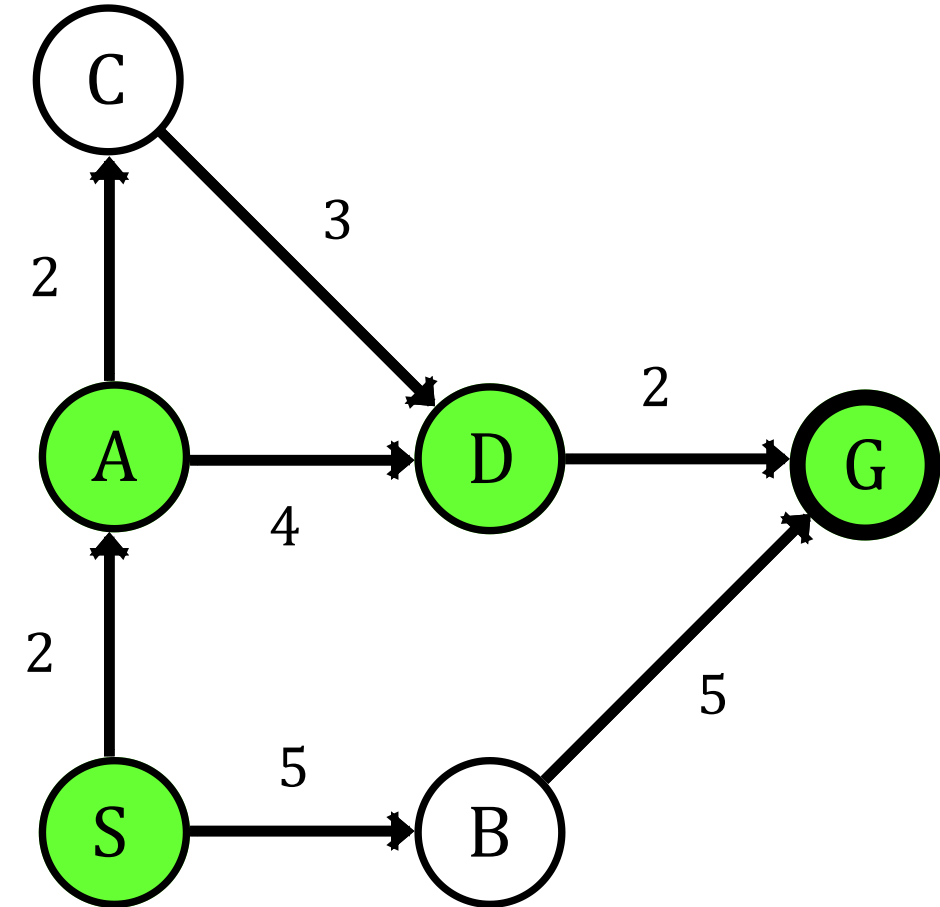


$$f(n) = g(n) + h(n)$$

# A\* Search (Problem 02)

Queue			
Path	g(n)	h(n)	f(n)
<G,D,A,S>	8	0	8
<G,B,S>	10	0	10
<D,C,A,S>	7	4	11

State	Heuristic: h(n)
S	10
A	2
B	3
C	1
D	4
G	0



Solution =  $S \rightarrow A \rightarrow D \rightarrow G$   
Path Cost =  $2 + 4 + 2 = 8$

As minimum path is the goal path, so we have found a solution.