

Artificial Intelligence (CS6380)

State Space Search

State space search: notation

Abstract the problem as a state space search problem

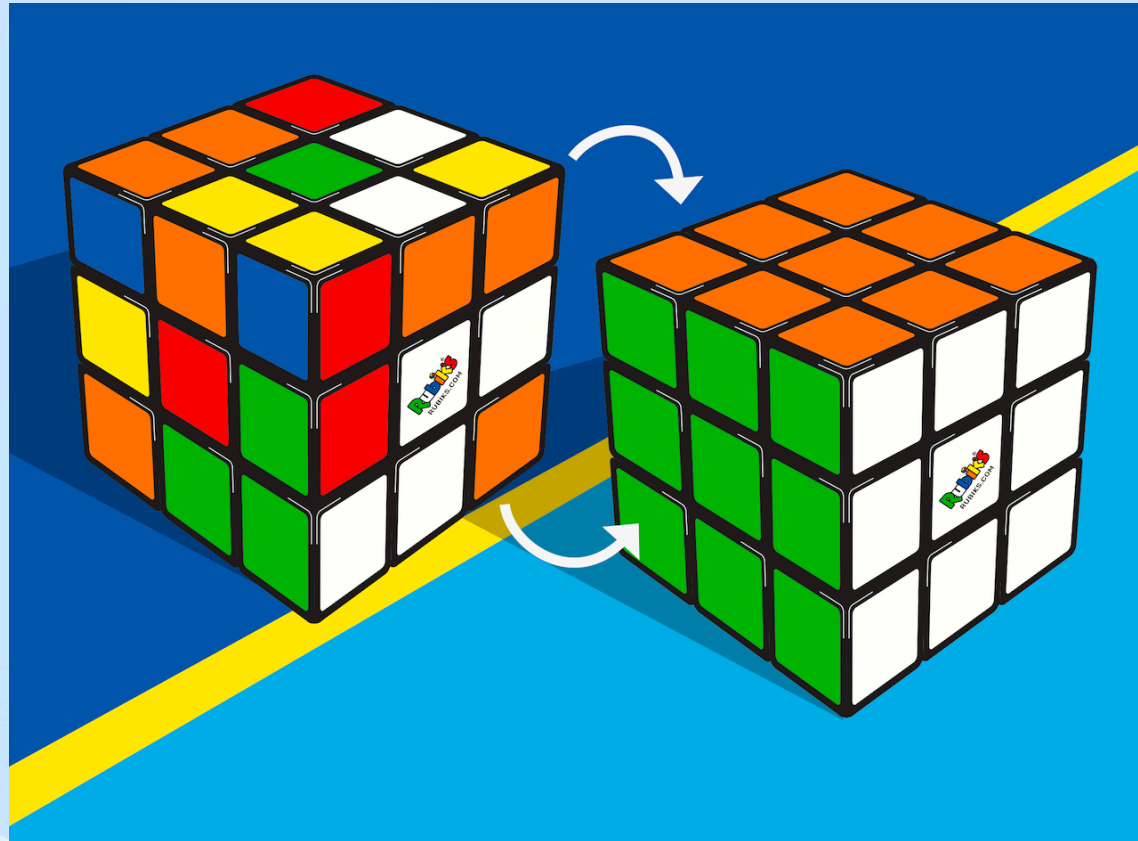
Level of abstraction: too detailed vs too coarse

Path finding : CSE dept to main gate. How to model?

- Set of states (state space)
- Initial state
- Goal states / goalTest / is goal function
- Actions
- Transition function
- Action cost function

Problem 1

- Do you **know** how to solve the cube?
- Can you try to solve the Rubik's cube?
- How good is the solve?



Rubiks cube

- **Set of states (state space):** all configurations of the cube. Depending on the representation. $\sim 10^{19}$ states.
- **Initial state:** given configuration
- **Goal states / goalTest / is goal function:** solved cube
- **Actions:** face = T / Bt / L / R / F / Bk; rotate = 90 / 180 / 270
- **Transition function:** config-1 **T-180** config-2, ...
- **Action cost function:** unit cost

Trivia

- Designed by sculptor and architect Rubik (1974)
- Initially called as Magic cube

Problem 2

8		6
5	4	7
2	3	1

	1	2
3	4	5
6	7	8

Eight puzzle

- Set of states (state space)
- Initial state
- Goal states / goalTest / is goal function
- Actions
- Transition function
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Problem 3



- Set of states (state space)
- Initial state
- Goal states / goalTest / is goal function
- Actions
- Transition function
- Action cost function

- Man, goat, wolf, cabbage puzzle.
- Boat can carry at most 2 things and there are constraints on who can stay together safely.
- How does the man take everyone across the river?

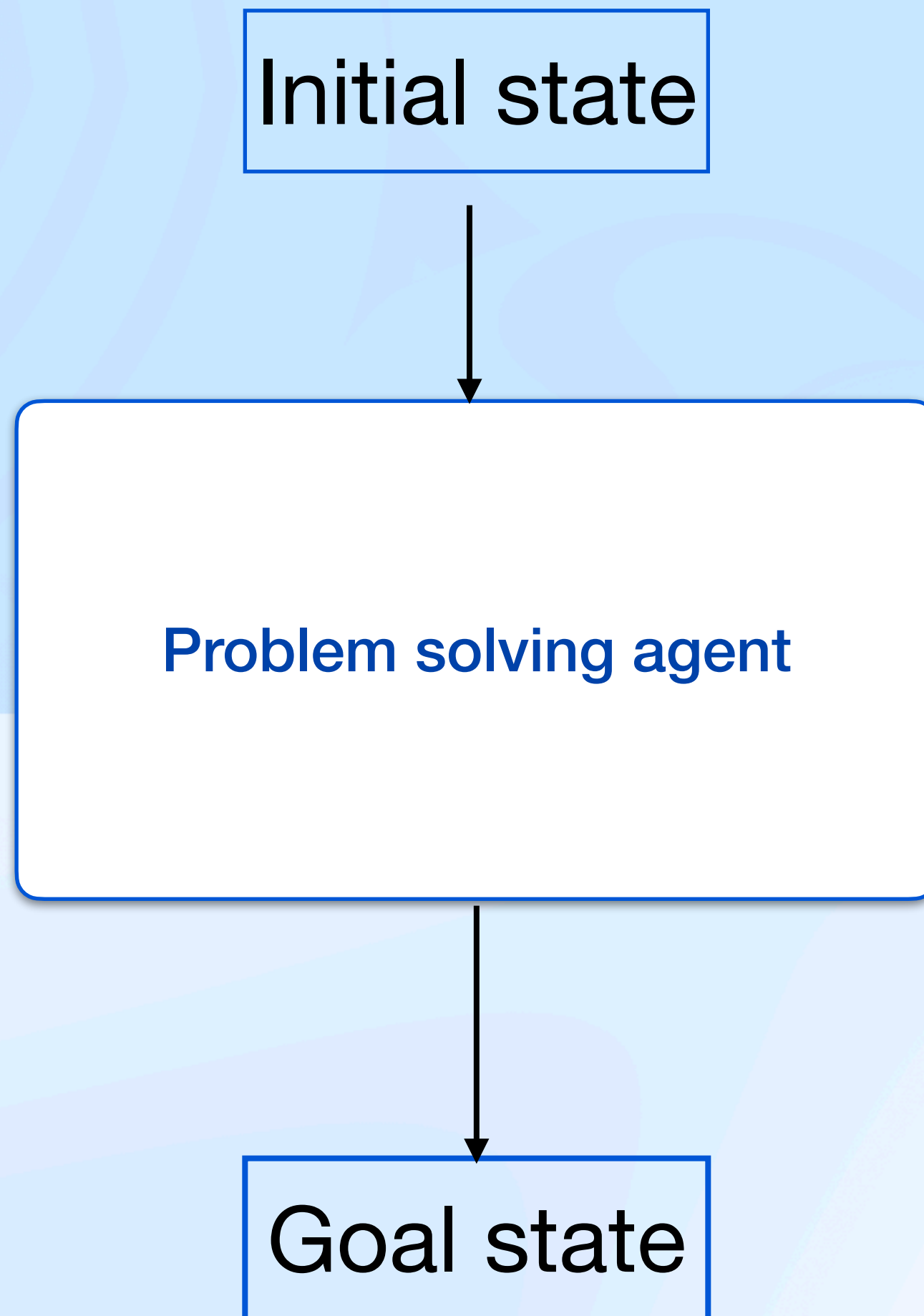
Problem 4

Knuth's conjecture

- Start with integer 4.
 - Apply sq. root, floor, factorial.
 - Goal : to obtain the desired integer.
- Set of states (state space)
 - Initial state
 - Goal states / goalTest / is goal function
 - Actions
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 - Action cost function

https://oisinmoran.com/projects/root_floor_fact_four

Problem solving agent



Single agent solves/ attempts to solve all problems

- Rubik's cube
- 8 puzzle
- Man, cabbage, goat, fox
- $4 \rightarrow 5$ (Knuths conjecture)

State space is a graph: nodes as states and arcs representing transitions.
State space graph is not given to us. It is present implicitly

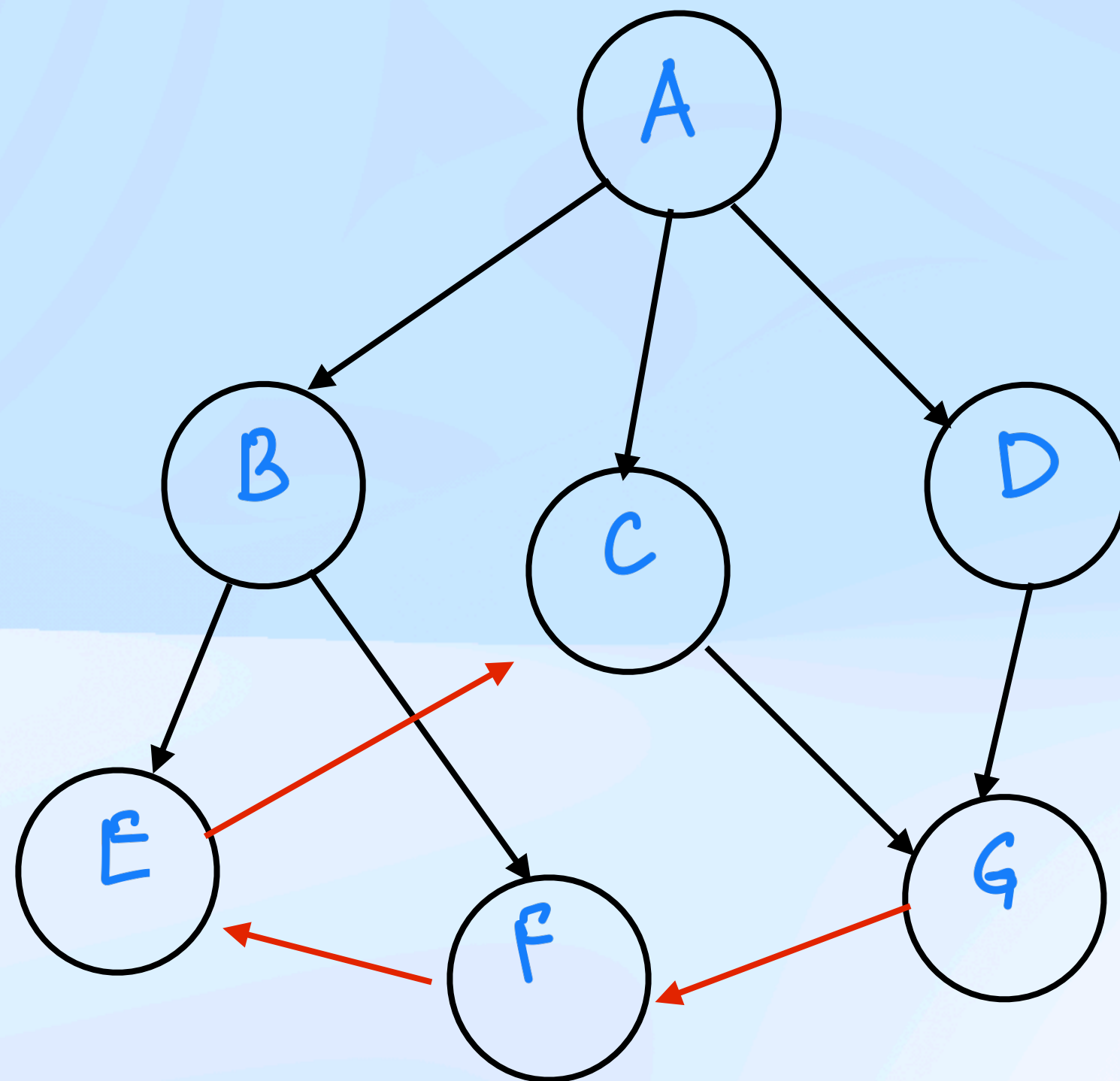
Search algorithm : evaluation

How do we evaluate different search algorithms?

- **Completeness:** does the algorithm find a solution when there is one and report failure when a solution does not exist?
- **Cost optimality:** does it find the lowest cost path amongst all solutions?
- **Time complexity:** how long does it take to find a solution?
 - Graph is not given explicitly. Cannot use usual parameters like $|V|$, $|E|$
- **Space complexity:** how much memory is required to perform the search?

Uninformed search

How to search?



For a particular node expand its neighbourhood /
moveGen function (filter invalid states if generated)

- Generates child nodes.
- Pick one of the child nodes for further expansion
 - Which one to select?
 - Need some way to order child nodes. Use a **function f**
- Maintain set of nodes to expand. Call it **frontier / open list**
- What is missing in the state space graph beside?
 - **Cycles / loops.**

Generic search algorithm

Create an empty **frontier** and insert start-node to **frontier**

Create an empty **reachedList** and insert (start-node, initial-cost) to **reachedList**

While frontier not empty do

- Extract **best** node from frontier. // **best** is decided via **function f**
- If node is goal node return node
- Expand node to get child nodes
- For each child node do
 - $\text{newCost} = \text{node.path-cost} + \text{transition-cost}$
 - If (child not in **reachedList**)
 - Add child to **frontier**
 - $\text{child.parent} = \text{node}$
 - Add (child, new cost) to **reachedList**
 - Else if $\text{newCost} < \text{child.path-cost}$ // child is in **reachedList**
 - Add child to **frontier**
 - $\text{child.parent} = \text{node}$
 - Replace occurrence of child in **reachedList** by (child, newCost)

Return failure

Generic search algorithm

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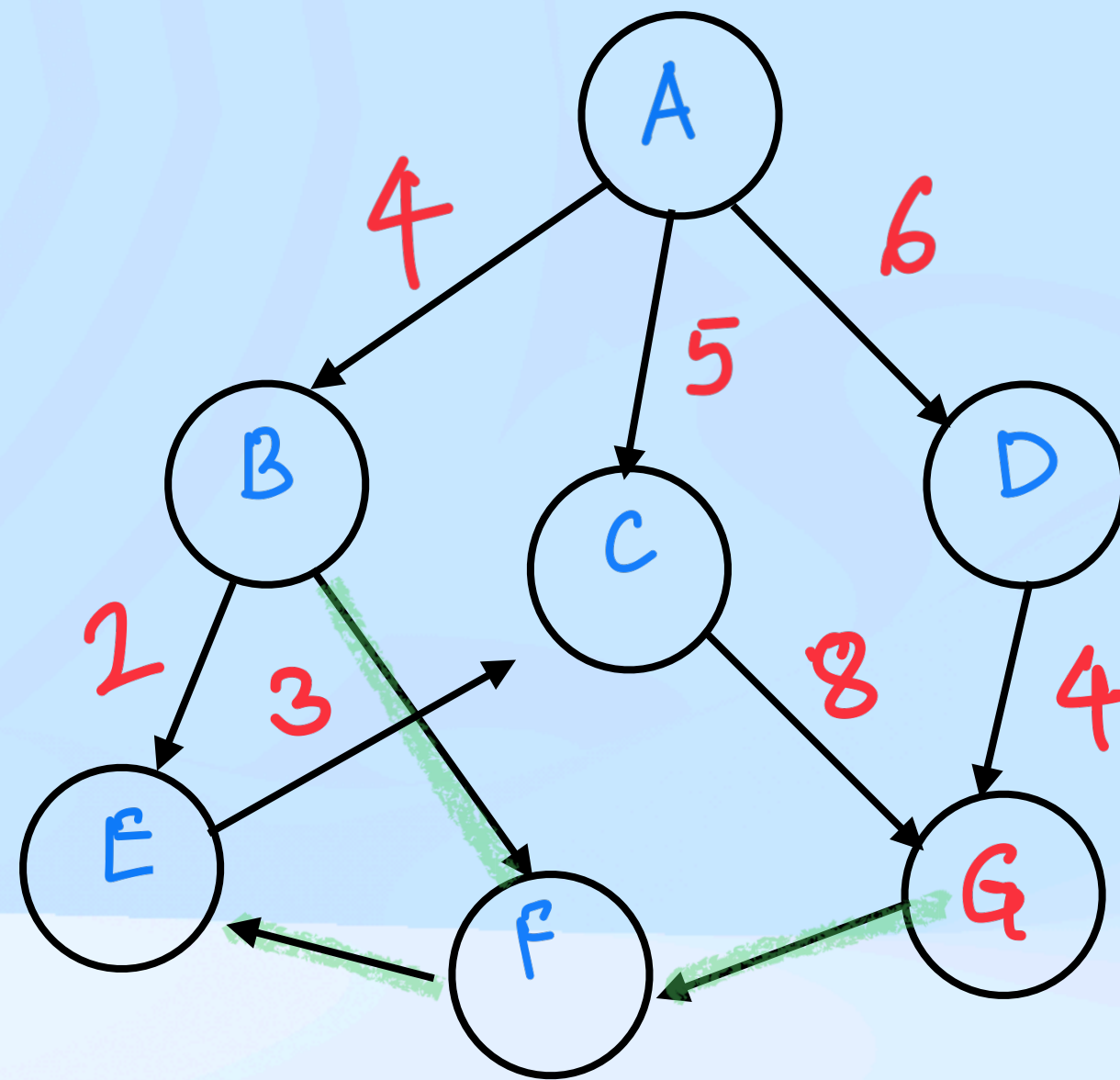
Return failure

problem specific

late goal test.

How can we use **function f** to get familiar algorithms?

Example continued

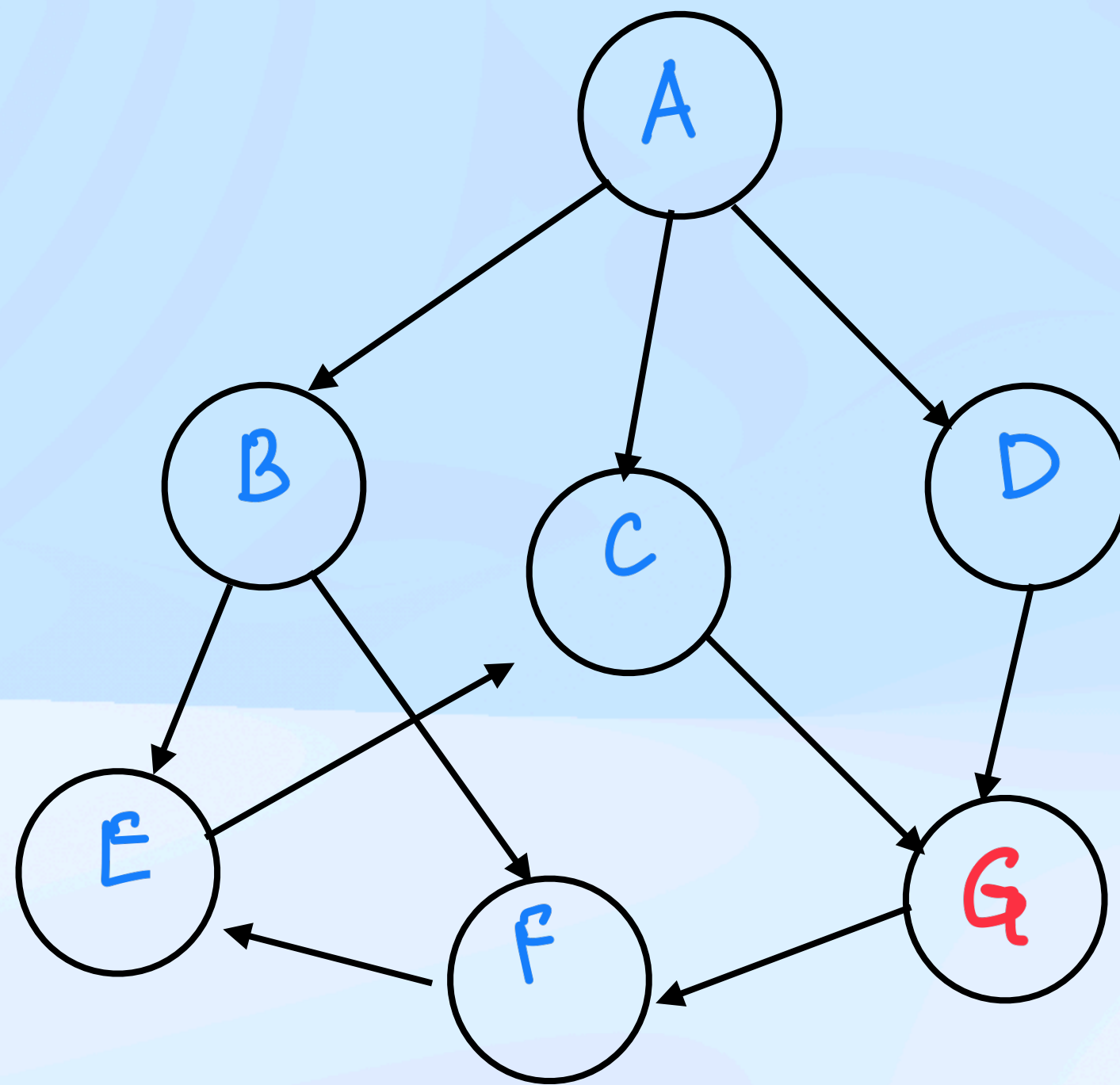


Paths from $A \rightsquigarrow G$

- ① $A \rightarrow B \rightarrow E \rightarrow C \rightarrow G$
- ② $A \rightarrow B \rightarrow F \rightarrow E \rightarrow C \rightarrow G$
- ③ $A \rightarrow C \rightarrow G$
- ④ $A \rightarrow D \rightarrow G$

- **b** : branching factor or maximum number of successors of a node
- **d** : number of actions in an optimal solution
- **m** : maximum number of actions in any path
- **C*** : cost of optimal solution
- $\epsilon > 0$: cost of the cheapest action

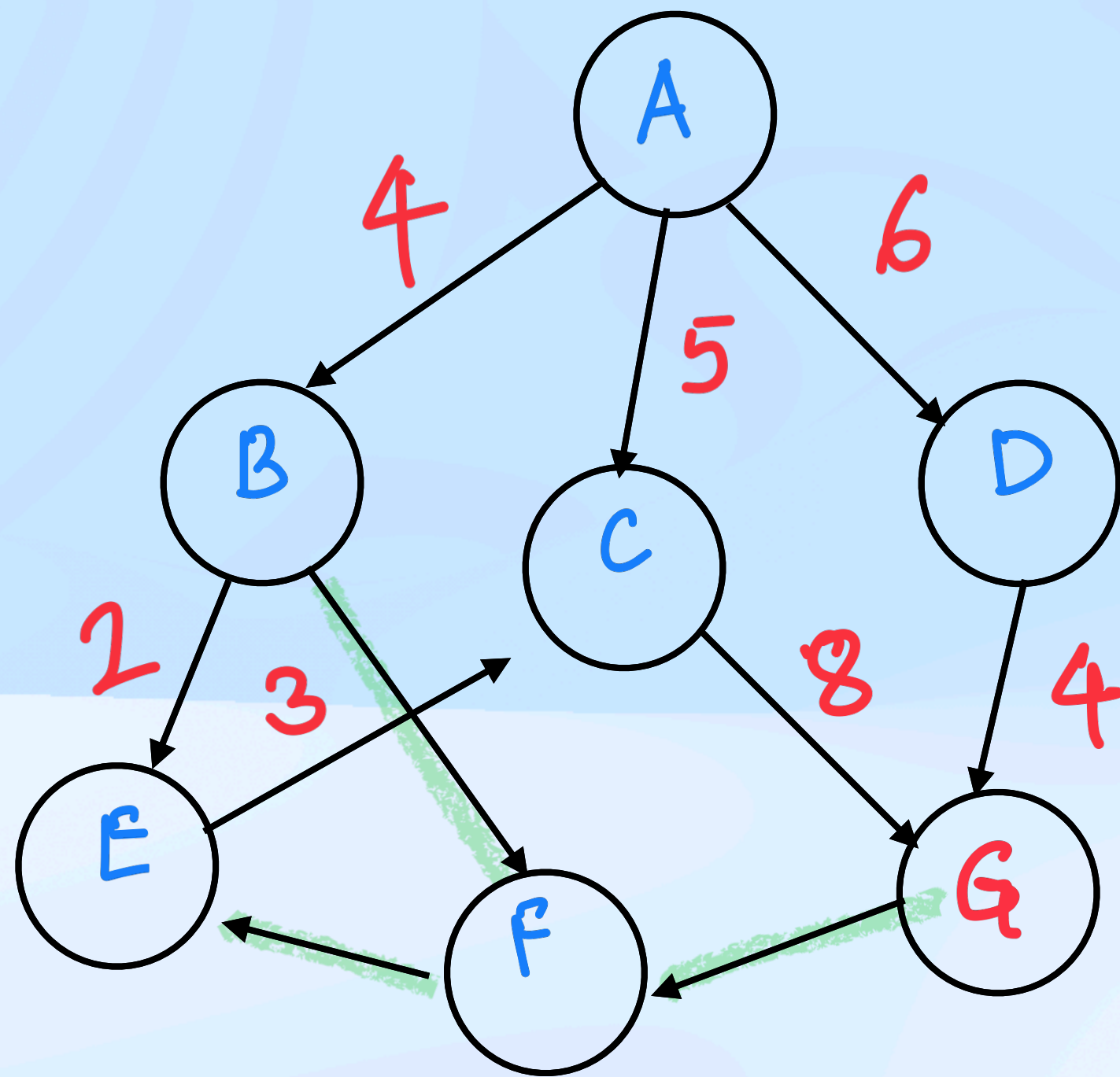
Breadth First search (BFS)



function f : depth of node.

- **Completeness:** yes if the space is finite or the goal is reachable from the start state.
- **Cost optimality:** yes for uniform cost actions. No when the costs are not uniform.
- **Total number of nodes generated:** $1 + b + b^2 + b^3 + \dots + b^d$
- **Time complexity:** for finite state spaces : $O(|V| + |E|)$. For infinite spaces when goal is reachable: proportional to the total number of nodes generated.

Uniform cost search (Dijkstra)

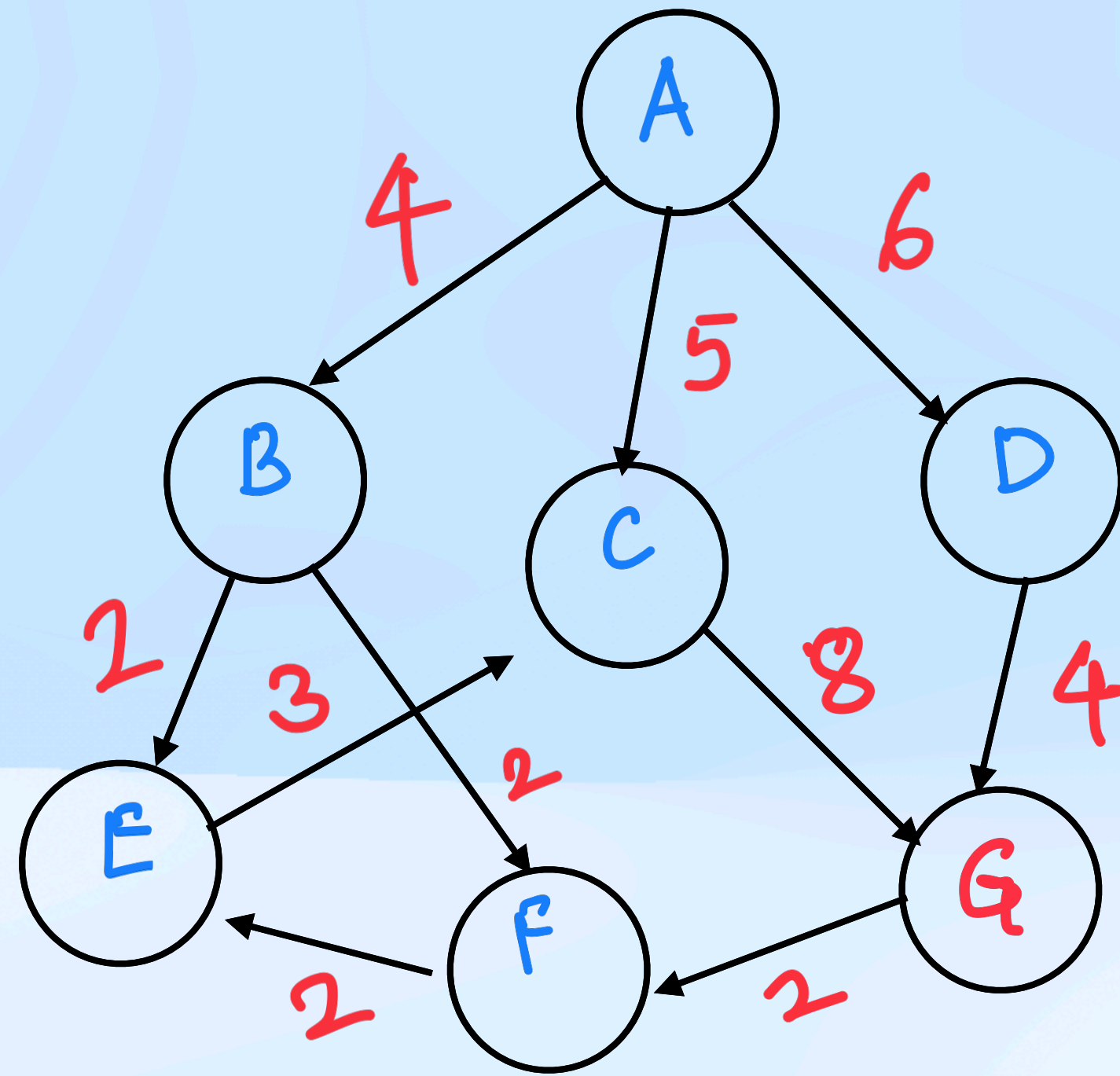


Paths from A \rightsquigarrow G

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- ③ $A \rightarrow C \rightarrow G$
- ④ $A \rightarrow D \rightarrow G$

function f : path cost of node.

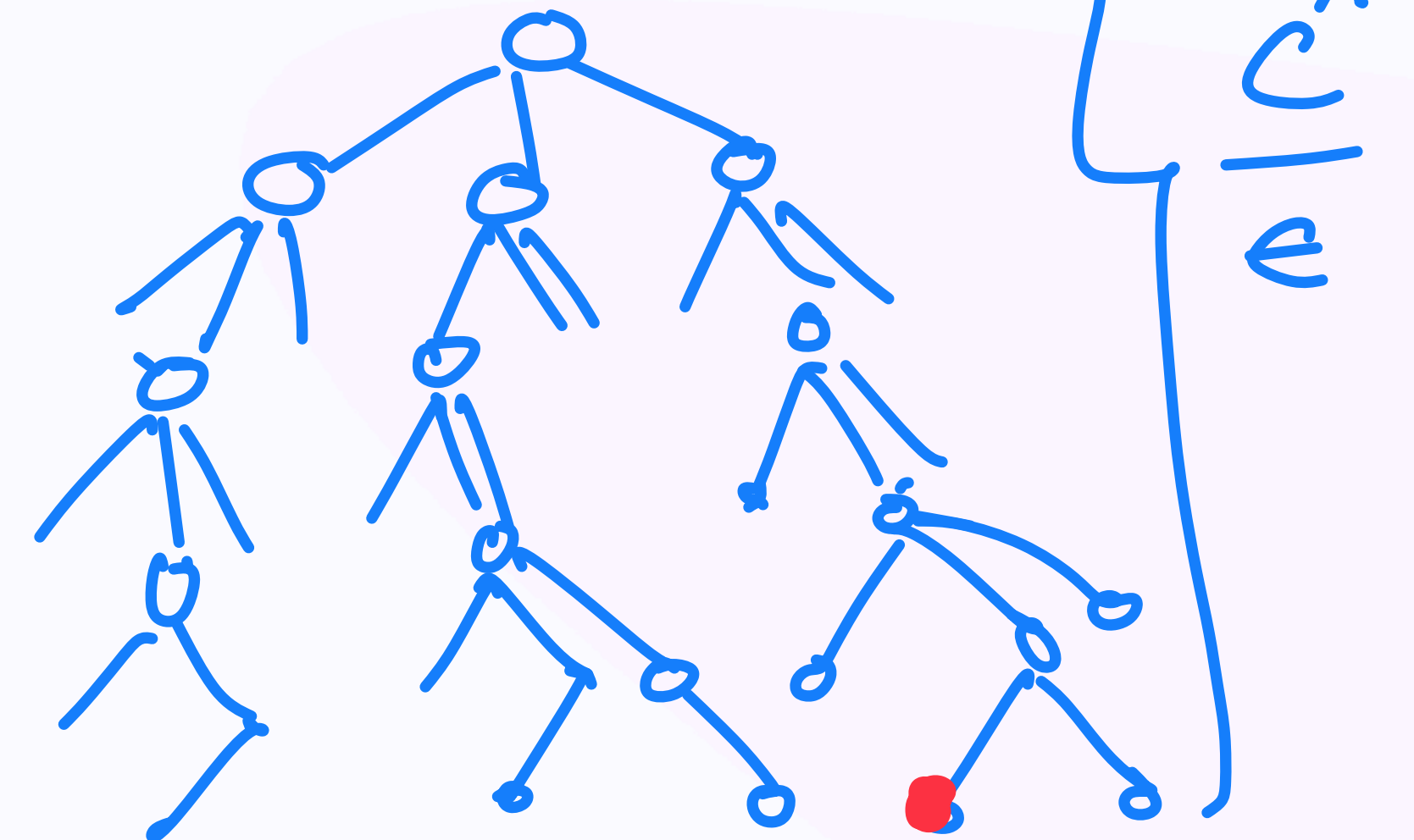
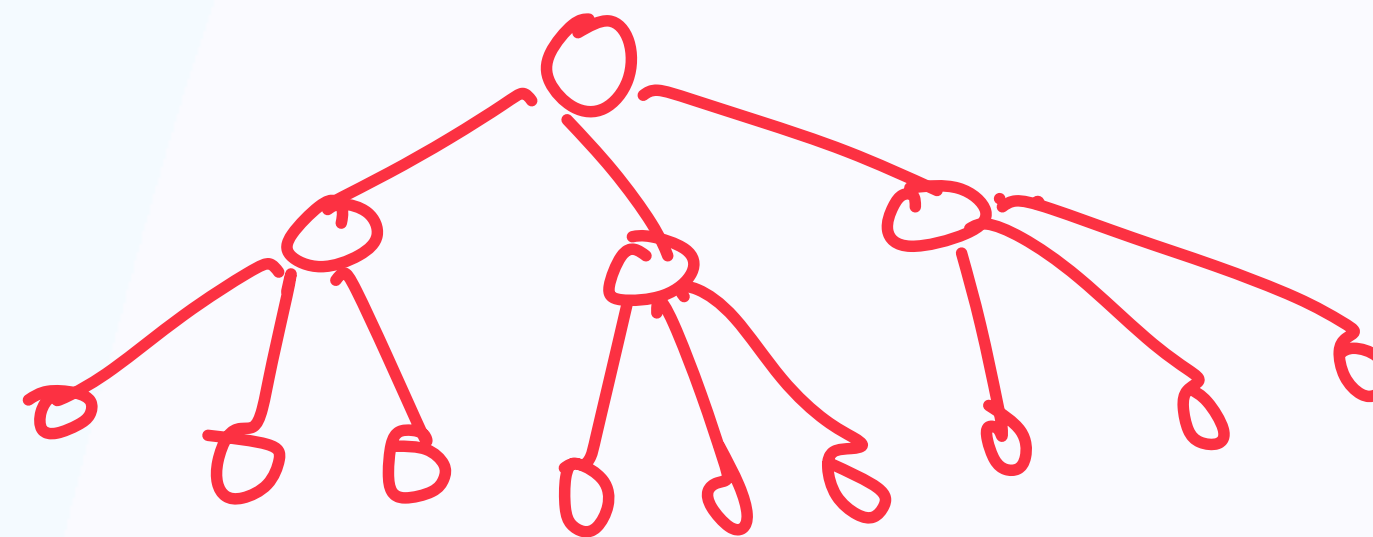
Uniform cost search (Dijkstra)



- **Completeness:** yes if the space is finite or the goal is reachable from the start state.
- **Cost optimality:** yes for uniform cost actions. No when the costs are not uniform.
- **Time and space :** for finite state spaces : $O((|V| + |E|) \log(|V|))$, $O(|V| + |E|)$. For infinite spaces when goal is reachable: proportional to the total number of nodes generated.

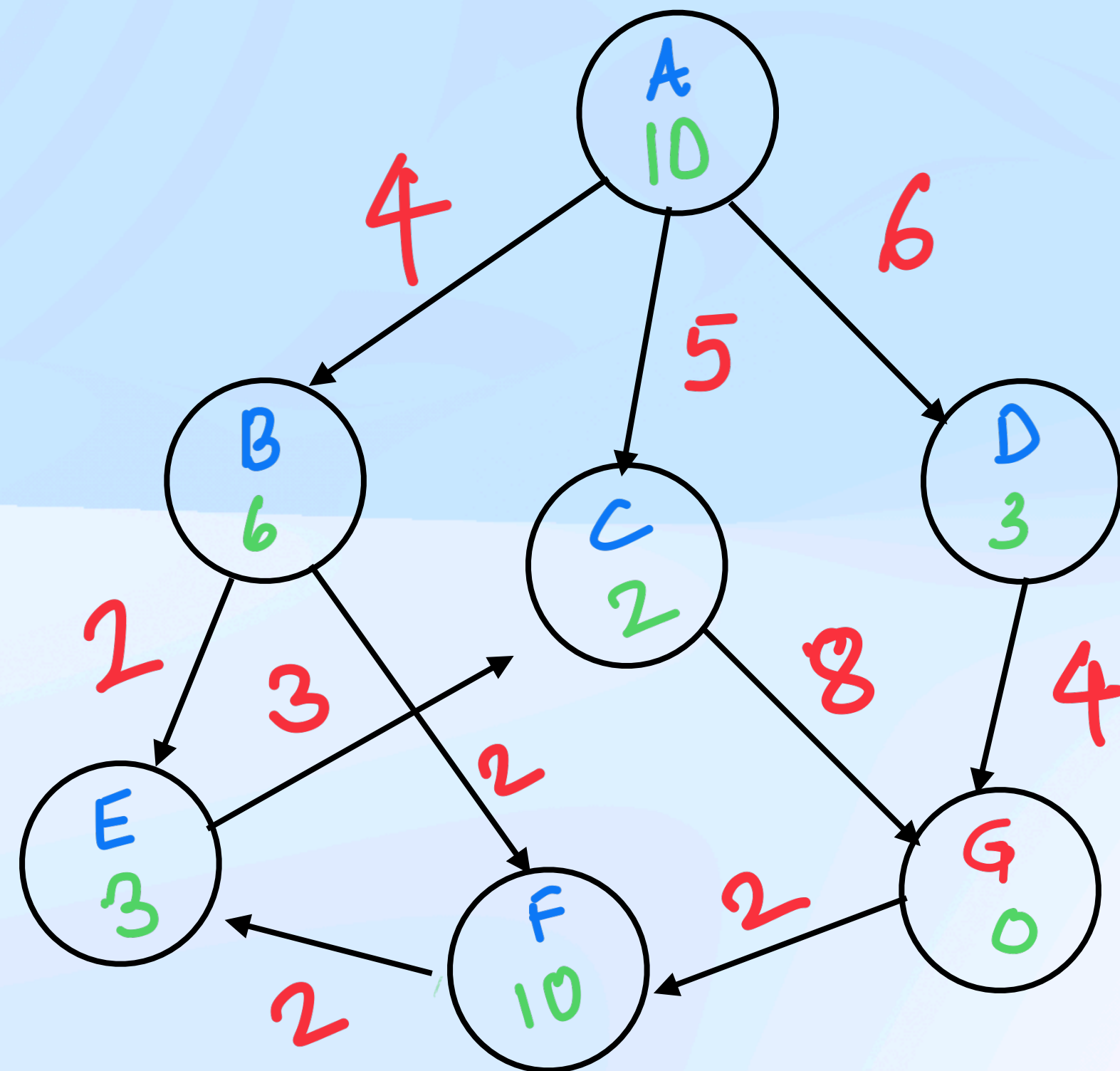
$$b = 3, \quad d = 2, \quad C^* = 10, \quad \epsilon = 2$$

function f : path cost of node.



Informed search

Greedy best-first search



Number inside the node : estimate of cheapest cost from node to goal. Call this $h(n)$.

Recall is path-cost. Call it $g(n)$.

Run the generic search algorithm with $f(n) = h(n)$

Does it return optimal cost path?

No! It gives $A \rightarrow C \rightarrow G$.

How many states were explored?

Combining $h(n)$ and $g(n)$

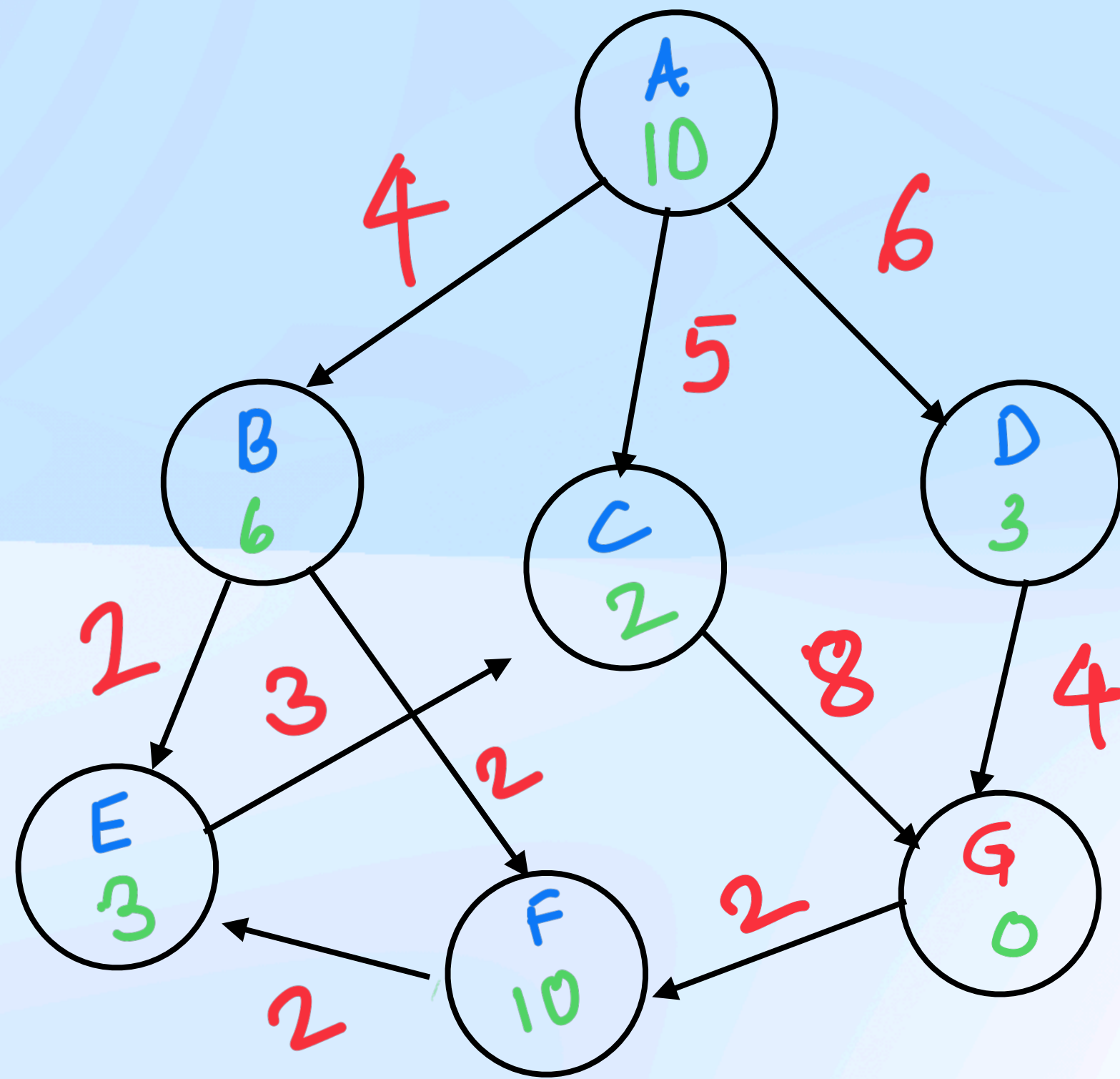
Number inside the node : estimate of cheapest cost from node to goal. Call this $h(n)$.

Recall is path-cost. Call it $g(n)$.

Run the generic search algorithm with $f(n) = h(n) + g(n)$

Does it return optimal cost path?

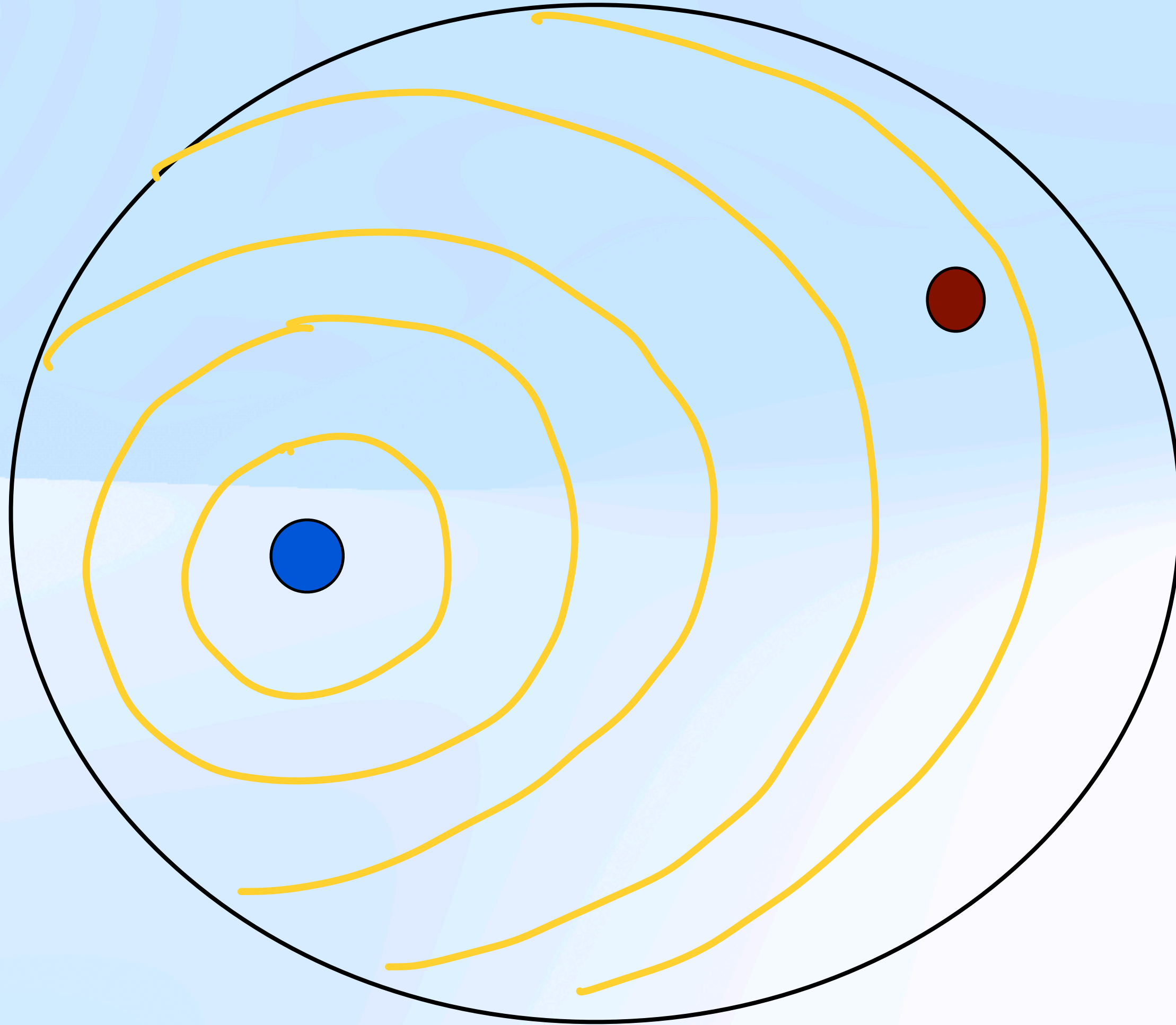
Yes! It gives $A \rightarrow D \rightarrow G$



function f : path cost (start, node) + estimated cost (node, goal)

This gives us the A* Algorithm

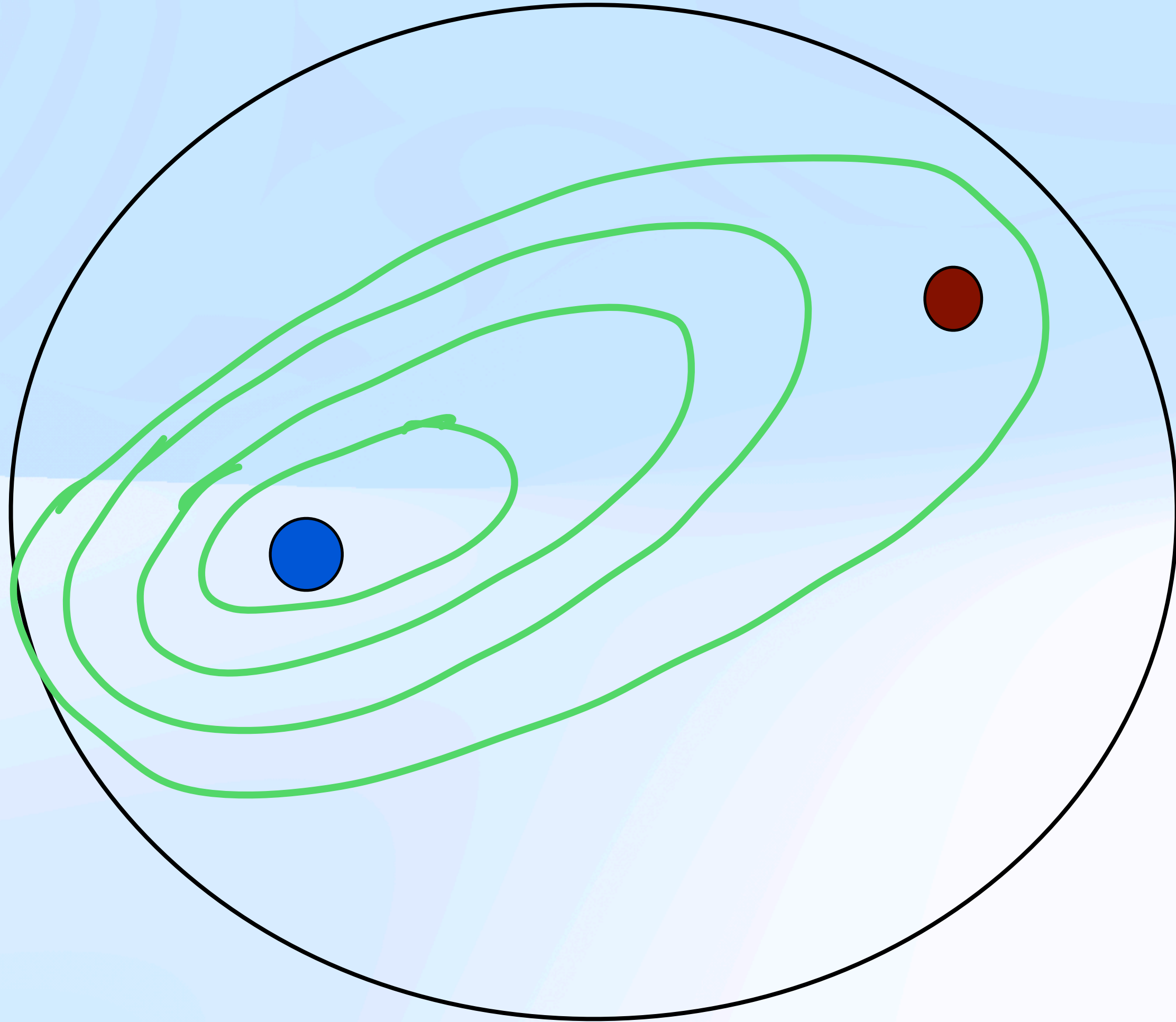
Dijkstra's algorithm: contours



We have contours of g-cost.

Contours spread equally around the start state with no preference to the goal

A* algorithm: contours..



We have contours of $g+h$ cost.

With a good heuristic function, contours stretch towards a goal and become focused towards goal state.