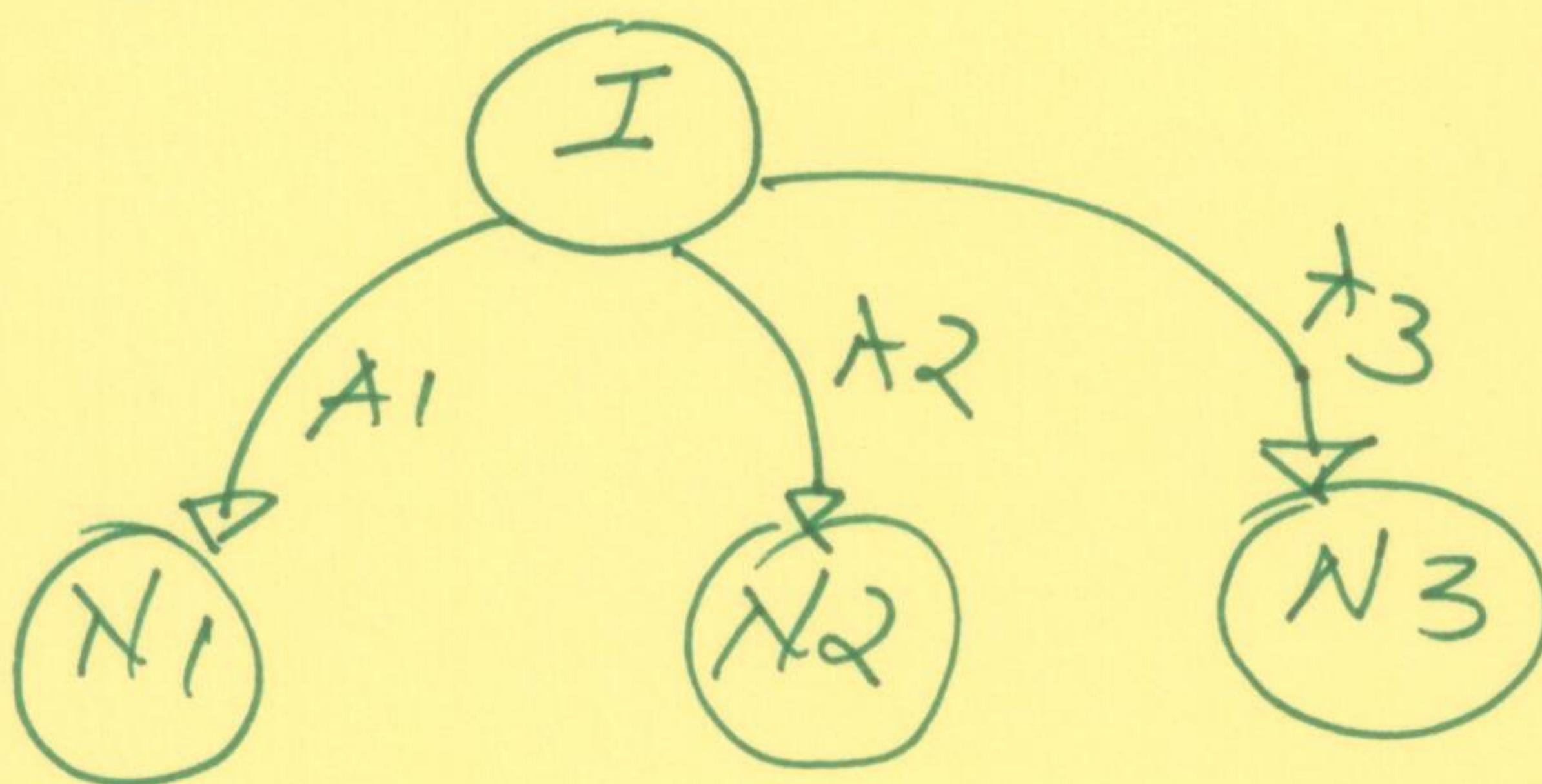


Search Trees



Step 1
Current Node

(I)
Frontier = {I}
Next node = ?

- Remove I from frontier.
- is I a goal?

c) NO
Expand I

$$\begin{aligned} A_1(I) &= N_1 \\ A_2(I) &= N_2 \\ A_3(I) &= N_3 \end{aligned} \quad \left. \begin{array}{l} \text{expanded} \\ \text{nodes!} \end{array} \right\}$$

d) Add expanded nodes to Frontier

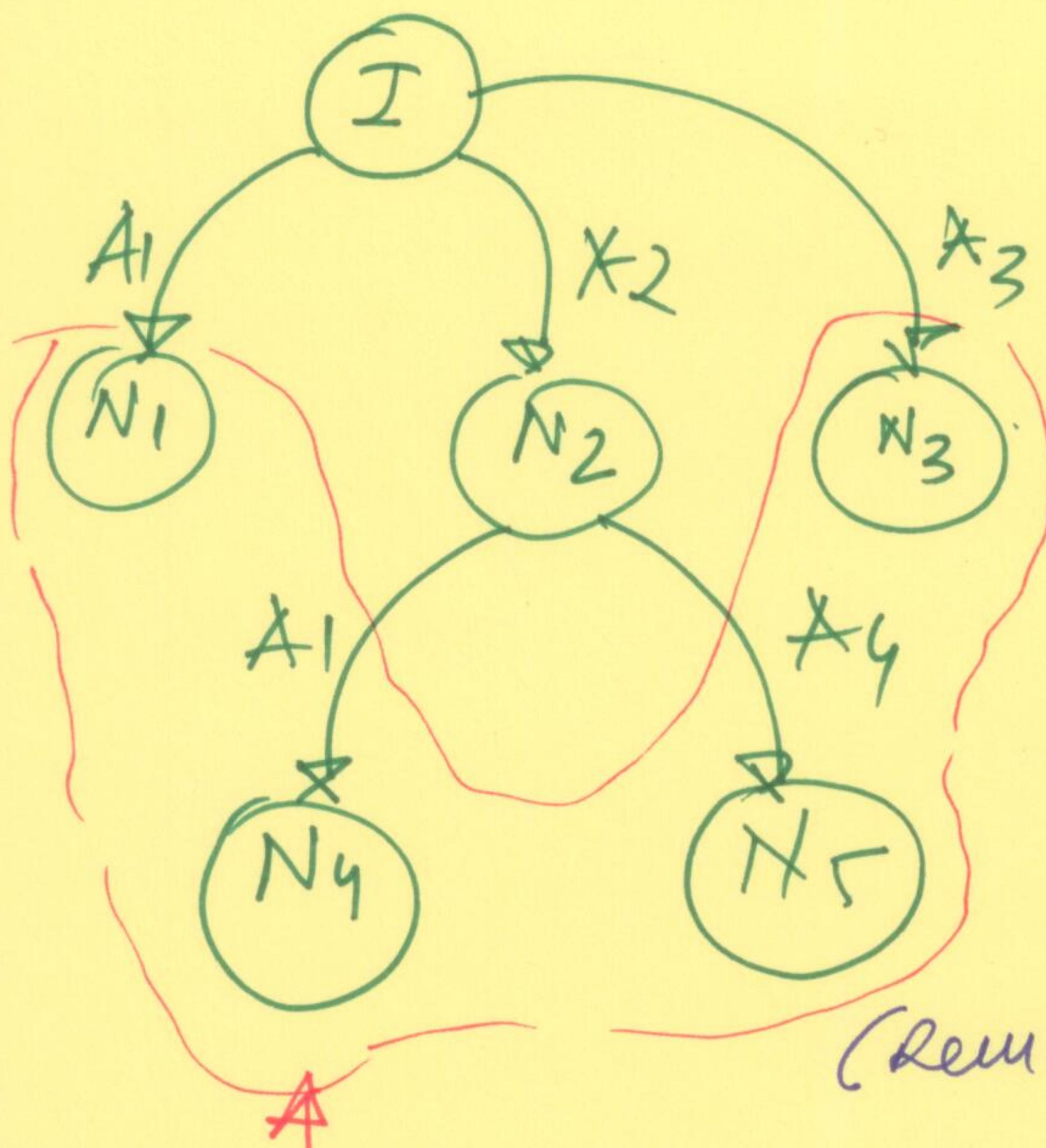
$$\text{Frontier} = \{N_1, N_2, N_3\}$$

Step 2 a) Remove a node from Frontier

$$= \boxed{N_2} \Rightarrow \text{New Frontier}$$

Current node ≠ N2

- is N2 a goal? NO
- expand N2



Step 2 (cont)

$$x_1(x_2) = x_4$$

$$A_4(N_2) = N_5$$

- d) Add expanded nodes to frontier

(remember New frontier
= {N₁, N₃, N₅})

$$\text{FRONTIER} = \{N_1, N_4, N_3, N_5\}$$

- STEP 3
- Remove a node from frontier
 $\Rightarrow N_4 \Rightarrow$ Current Node
 - Is N₄ = goal?

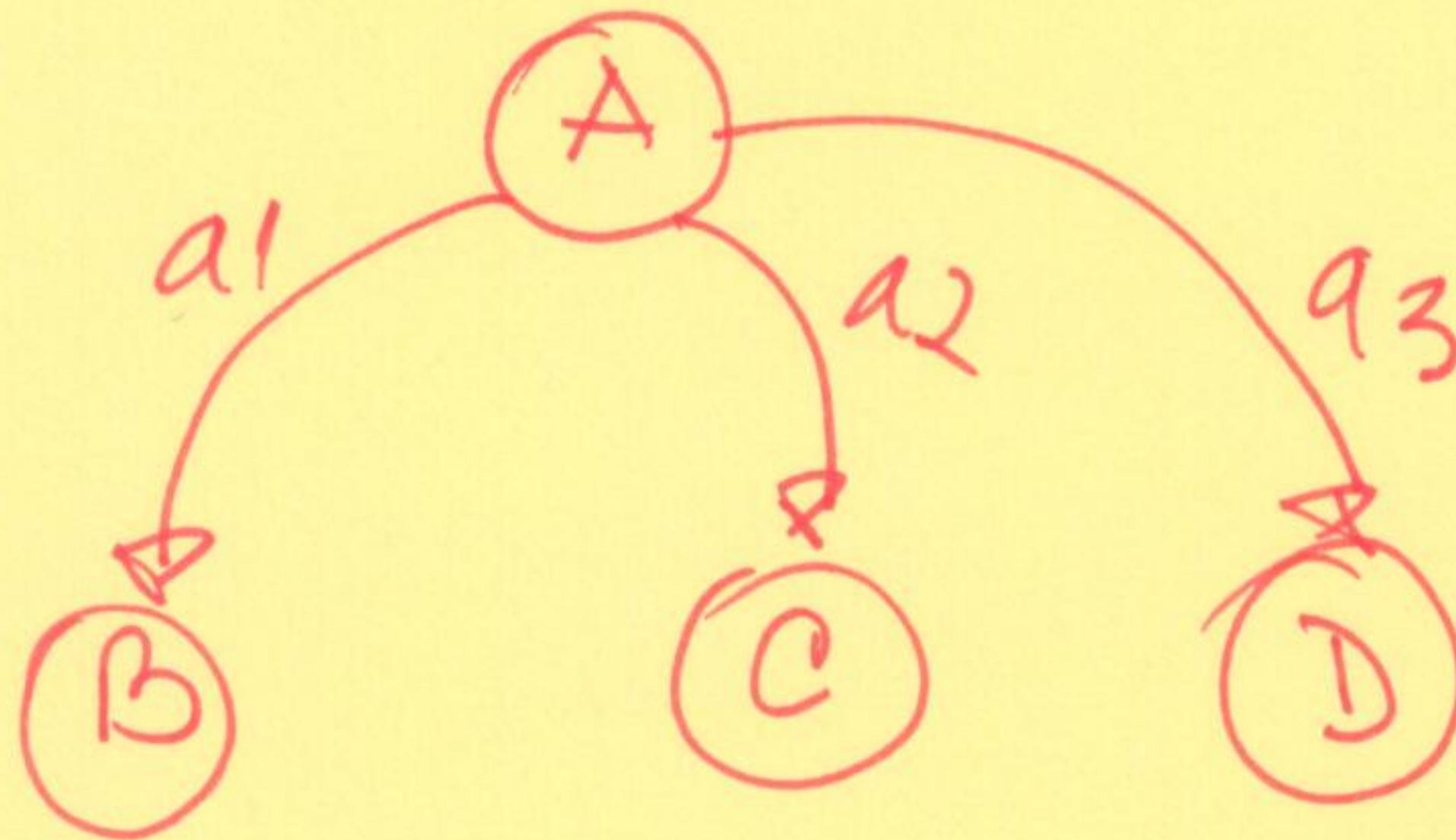
YES

Return SOLUTION:

$$I \xrightarrow{A^2} N_2 \xrightarrow{A^1} N_4 = \text{goal}$$

Graph - Search

3



$\bar{E}xplor\bar{e}d = \{ A \}$
 $\bar{F}rontier = \{ A \}$

Step 1 a) Remove A from $\bar{F}rontier$
Current Node = A

b) Is A a goal?
NO

c) ~~Expand~~ $\bar{E}xplor\bar{e}d = \{ A \}$
 d) Expand A

$a_1(A) = B$; $a_2(A) = C$; $a_3(A) = D$
 - add expanded nodes to $\bar{F}rontier$
ONLY if not in $\bar{F}rontier$ or $\bar{E}xplor\bar{e}d$ set

$\bar{F}rontier = \{ B, C, D \}$

Step 2 a) Remove a node from $\bar{F}rontier \Rightarrow B$

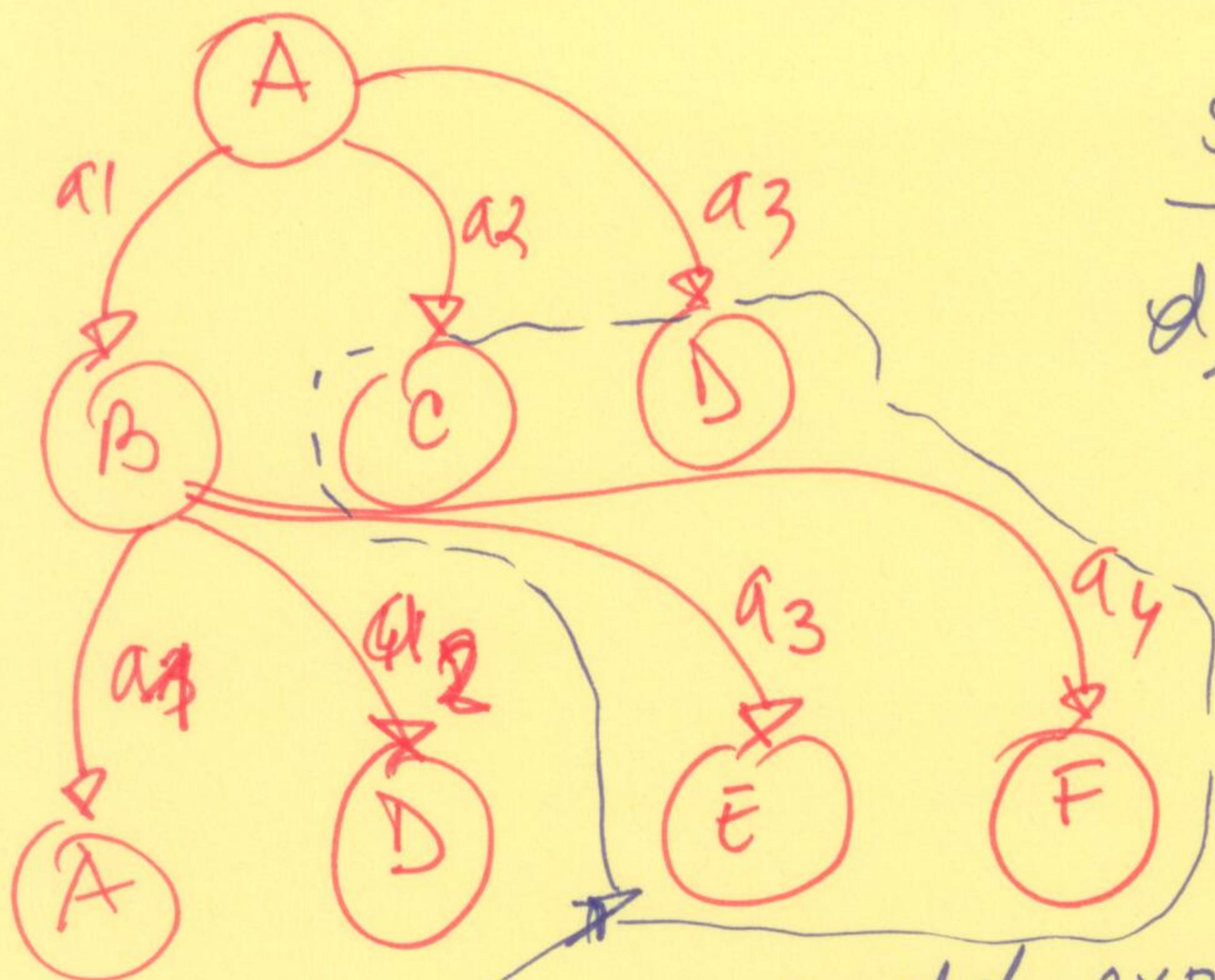
Current Node = B

New $\bar{F}rontier = \{ C, D \}$

b) Is B a goal? NO

c) $\bar{E}xplor\bar{e}d = \{ A, B \}$

d) Expand $B = \dots$



Step 3 cont

d) expand B

$$a_1(B) = X \times$$

$$a_2(B) = D \times$$

$$a_3(B) = E \quad \{$$

$$a_4(B) = F \quad \}$$

→ add expanded nodes

in FRONTIER only if not in
Frontier or Explored

we had
Before Frontier = {C, D} \Rightarrow

Explored = {A, B}

\Rightarrow Frontier = {C, D, E, F}

Step 3 a) Remove a node from Frontier

$\Rightarrow C$

Current Node = C \Rightarrow Frontier = {D, E, F}

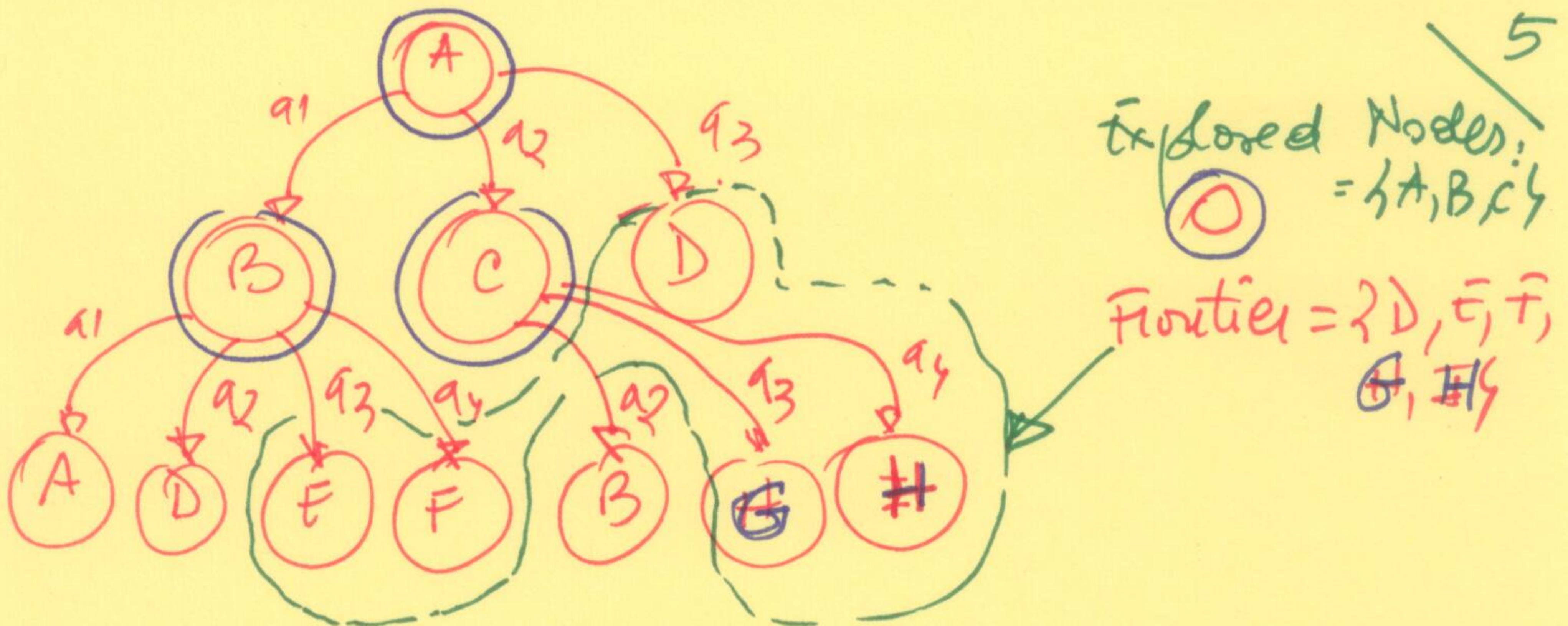
b) is C a goal? No

c) Explored = {A, B, C}

d) Expand C: $a_2(C) = B \quad a_3(C) = E \quad a_4(C) = F$

→ add expanded nodes in frontier
if not in frontier or explored

Frontier = {A, E, F, G, H}



Step 9 a) Remove a node from frontier.

Current Node: G \rightarrow Frontier = {D, E, F, H}

b) Is G a goal? YES

Solution $A \xrightarrow{a_3} C \xrightarrow{a_3} G$

LESSON LEARNED:

Graph search
does not allow
repeated states on

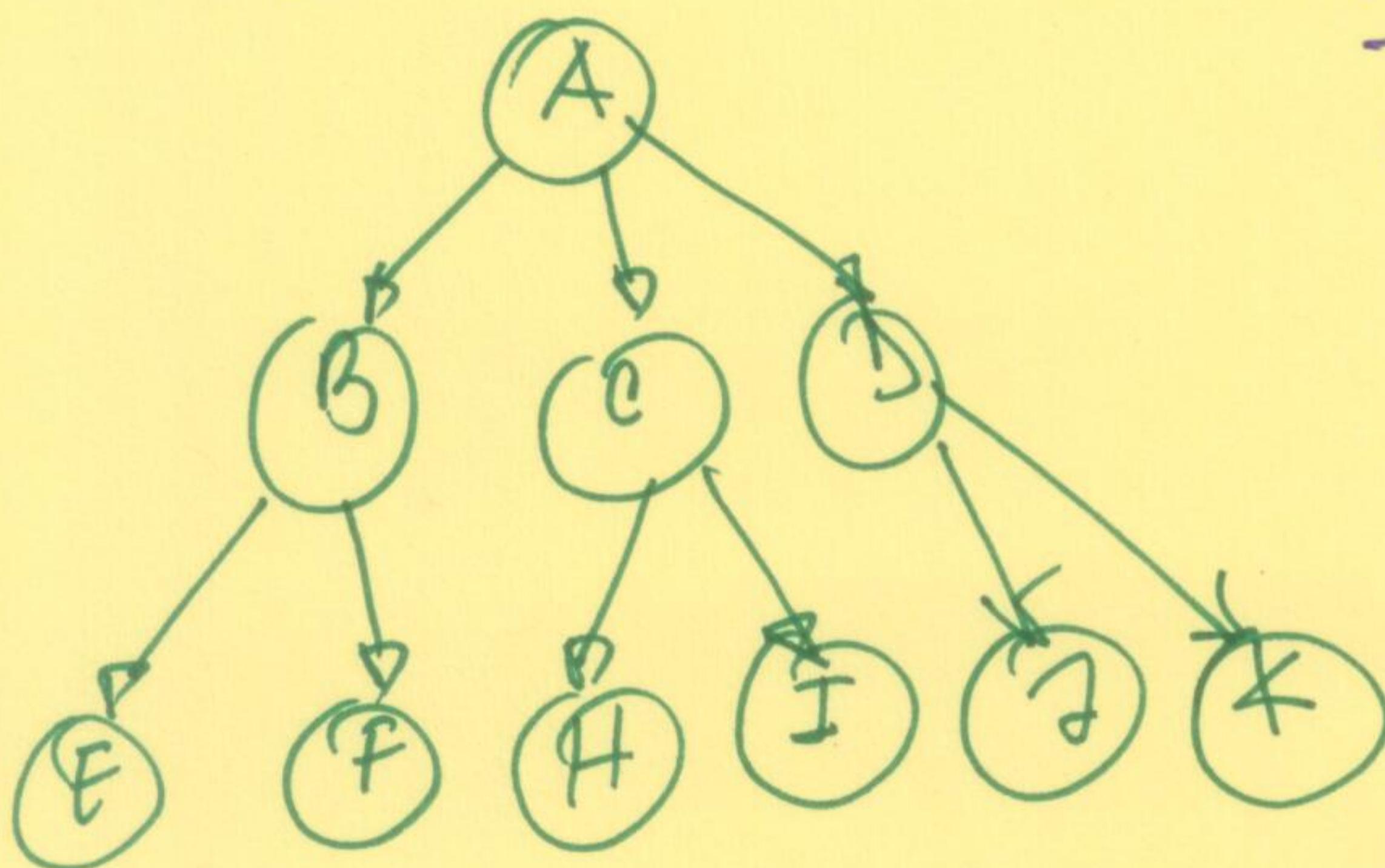
Frontier

or expanded list

Uninformed Search Problems

Example of Breadth-First Search

a) Consider the following search tree:



Initial Node = A

Goal Node = J

Frontier = {A} FIFO queue

Explorered = {}

Step 1 a) current node = A

b) children (A) = {B, C, D}

not in frontier
or explored!

c) A is goal? NO

d) Frontier = {B, C, D}
Explorered = {A}

Step 2 a) current node = B

Explorered = {A, B} Frontier = {C, D}

b) children (B) = {E, F} → not in Explorered or Frontier!

c) is B a goal? NO

d) Frontier = {C, D, E, F}

Step 3 a) current node = C

Explorered = {A, B, C} Frontier = {D, E, F}

b) children (C) = {G, H} → not in Explorered or Frontier!

c) is C a goal? NO

d) Frontier = {D, E, F, G, H}

2

Step 4 a) Current node = Δ
 Explored = {A, B, C, D} Frontier = {E, F, H, I}

b) Children (Δ) = {J, K} \rightarrow not in Explored or frontier!

c) Is Δ a goal? NO

d) Frontier = {E, F, H, I, J, K}

Step 5 a) Current node = E
 Explored = {A, B, C, D, E} Frontier = {F, H, I, J, K}

b) Children (E) = {}

c) Is E a goal? NO

d) Frontier = {F, H, I, J, K}

Step 6 a) Current node = F
 Explored = {A, B, C, D, E, F}

Frontier = {H, I, J, K}

b) Children (F) = {}

c) Is F a goal? NO

d) Frontier = {H, I, J, K}

Step 7 a) Current node = H
 Explored = {A, B, C, D, E, F, H} Frontier = {I, J, K}

b) Children (H) = {}

c) Is H a goal? NO

d) Frontier = {I, J, K}

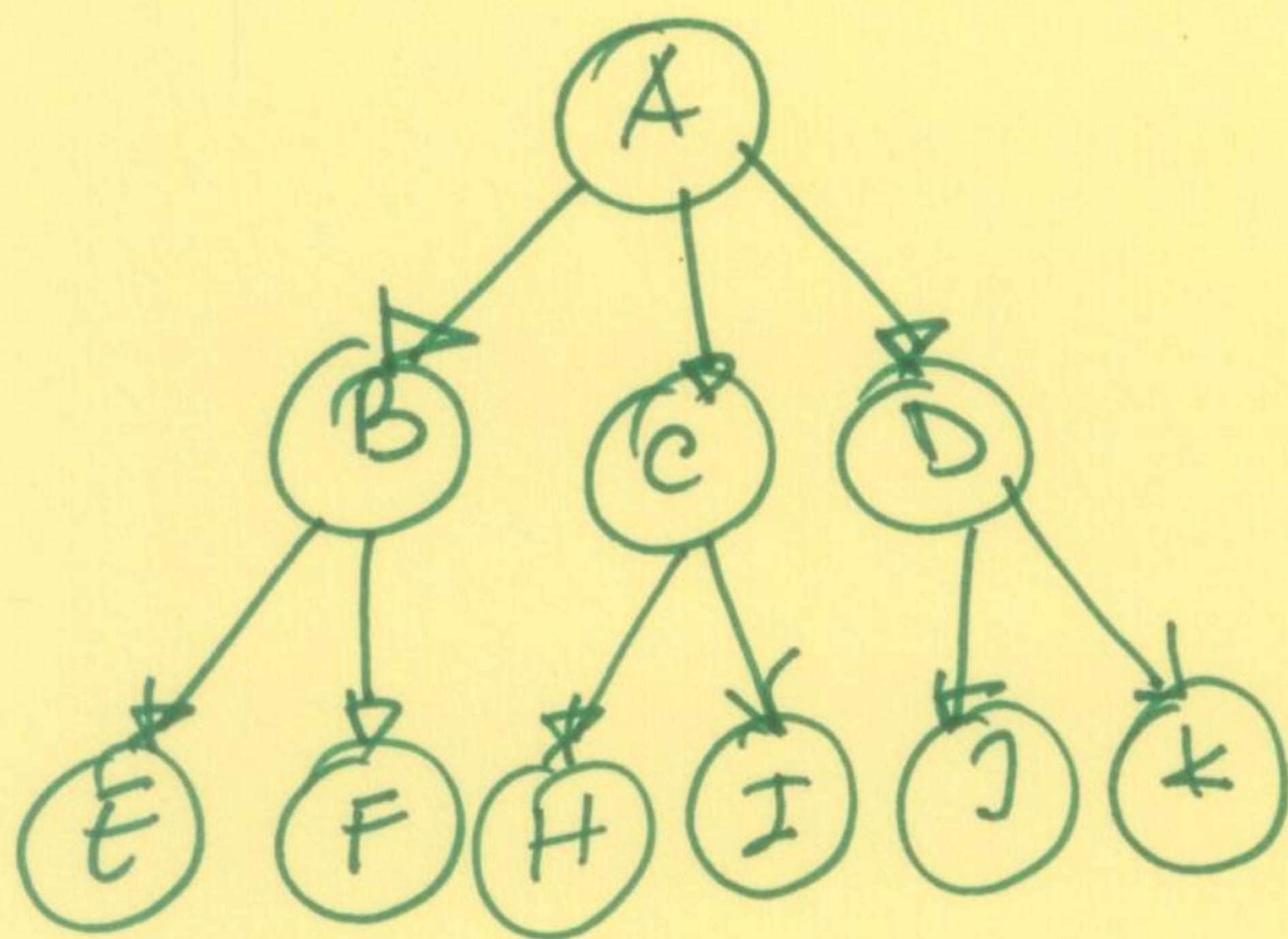
Step 8 a) Current node = I
 Explored = {A, B, C, D, E, F, H, I} Frontier = {J, K}

b) Children (I) = {}

c) Is I a goal? NO

d) Frontier = {J, K}

3

Step 9

a) Current node = J

Exploded = A, B, C, D, E, F, H, J

Frontier = A, C, D

b) childreach(J) = {F}

c) Is J a goal? YES

SOLUTION : $A \rightarrow D \rightarrow J$

How did I find it?

1. Which node expanded J?
(when did J first show up
on the Frontier?)

Step 4 \Rightarrow J is a child
of D

2. Which node expanded D?
(when did D first show up
on the Frontier?)

Step 1 \Rightarrow D is a child of A

I can create the solution path:

$A \rightarrow D \rightarrow J$.

initial
node

2

Example of Uniform Search

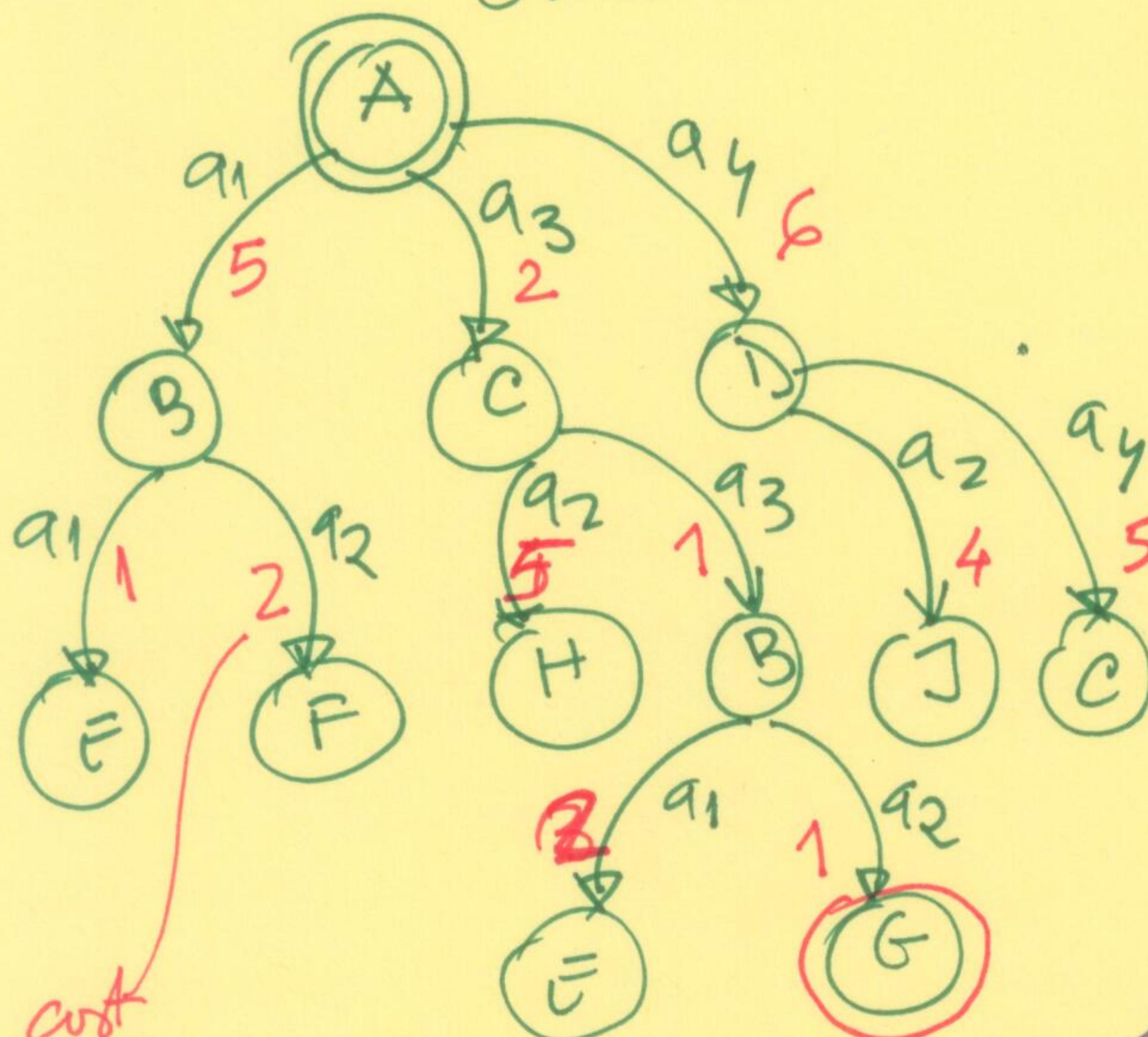
4

We always have $f(n) = \text{the path cost from initial node to node } n$

Problem: Actions = a_1, a_2, a_3, a_4

Initial State = A

Goal State = G.



Explored = { }

Frontier = { * }

Step 1 a) Current Node = A

b) is A the goal? No

c) Explored = { A }

Frontier = { * }

d) Consider for each available action the child-node

B = child(A, a1)
 $f(B) = 5$

C = child(A, a3)
 $f(C) = 2$

D = child(A, a4)
 $f(D) = 6$

* if B is not in explored or frontier
 \Rightarrow Frontier = { B }

* if C is not in explored or frontier
 \Rightarrow Frontier = { C, B }

* if D is not in explored or frontier
 \Rightarrow Frontier = { C, B, D }

Step 2

- a) Current Node = C $g(C)=2$ 5
- b) Is C a GOAL? No
- c) Explored = {A, C}

$$\text{Frontier} = \{B, D\}$$

- d) for each action \rightarrow child (C, a₂) = H < not in explored or frontier
- $$f^*(H) = g(H) + 5 = 2+5=7$$

$$\text{Frontier} = \{B, D, H\}$$

child (C, a₃) = B \rightarrow B is already in frontier

$$f^*(B) = g(B) + 1 = 2+1=3$$

But $3 < 5$

$$\Rightarrow \text{Frontier} = \{B, D, H\}$$

\uparrow replace it in frontier

Step 3

- a) Current Node = B $f^*(B)=3$

b) Is B a GOAL? No

- c) Explored = {A, B, C}

$$\text{Frontier} = \{D, H\}$$

child (B, a₁) = E $f^*(E) = g(E) + 2 = 3+2=5$
< not in explored on frontier

$$\text{Frontier} = \{E, D, H\}$$

child (B, a₂) = G $f^*(G) = g(G) + 1 = 3+1=4$
< not in explored on frontier

$$\text{Frontier} = \{G, E, D, H\}$$

Step 4

- a) Current Node = G $f^*(G)=4$

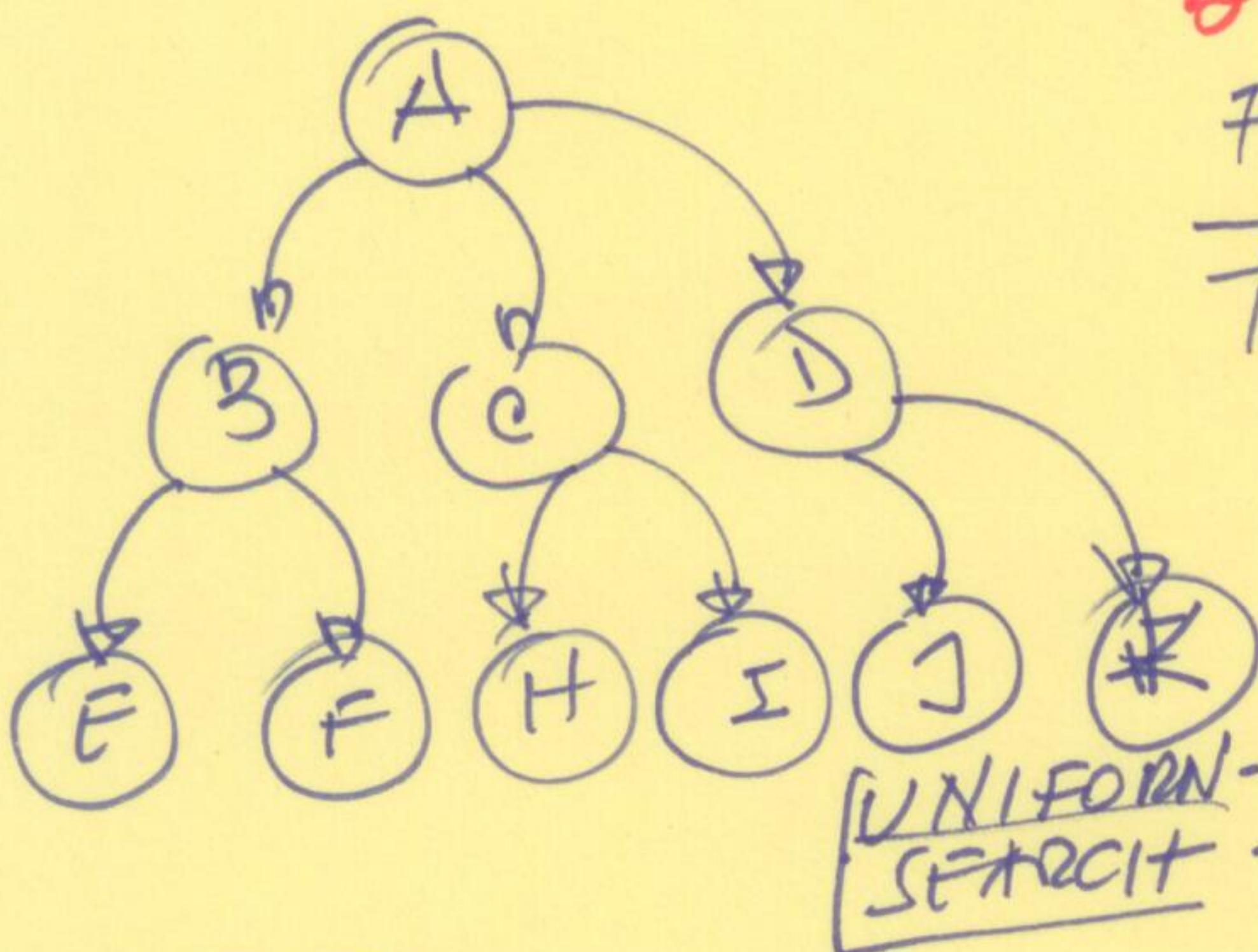
b) G is the GOAL!

SOLUTION: A → C → B → G PATH COST = 4

Qualifying PhD exam Question

Prove that breadth-first search is a special case of uniform-cost search.

Answer If all step costs $c(n_1, a_i, n_2)$ are equal then $g(n) \propto \text{depth}(n)$ and uniform-cost search becomes breadth-first search.



For example consider the illustrated search tree, with * initial frontier, with \leftarrow initial explored.

$$\text{Frontier} = \{A\} \quad \text{explored} = \emptyset$$

Step 1 Current Node = A
is A the goal? NO

$$\text{explored} = \{A\}$$

$$B = \text{child}(A) \quad p(B) = 1$$

~~$C = \text{child}(A)$~~ Frontier = {B}

$$C = \text{child}(A) \quad p(C) = 1$$

~~$D = \text{child}(A)$~~ Frontier = {B, C}

$$D = \text{child}(A) \quad p(D) = 1$$

~~$E = \text{child}(A)$~~ Frontier = {B, C, D}

Step 2 Current Node = B

$$\text{explored} = \{A, B\}$$

is B goal? NO

$$\text{child}(B) = \{C, D, E\} \quad p(E) = 1 + 2 = 3$$

$$\text{Frontier} = \{C, D, E\}$$

$$\text{child}(B) = \{F\} \quad p(F) = 3$$

$$\text{Frontier} = \{C, D, E, F\}$$

Step 3 Current Node = C $p(C) = 1$

Explored = {A, B, C}

Is C a GOTC? No.

child(C) = H $p(H) = 1 + 2 = 3$

Frontier = {D, E, F, H}

child(C) = I $p(I) = 1 + 2 = 3$

Frontier = {D, E, F, H, I}

The content of the frontier and explored-list are the same at each step with this obtained by Breadth-First Search

Step 4 Current Node = D $p(D) = 1$

Explored = {A, B, C, D} Frontier = {E, F, H, I, J, K}

Step 4 Current Node = E

Explored = {A, B, C, D, E} Frontier = {F, H, I, J, K}

Step 5 Current Node = H

Explored = {A, B, C, D, E, F} Frontier = {I, J, K}

Step 6 Current Node = I

Explored = {A, B, C, D, E, F, H} Frontier = {J, K}

Step 7 Current Node = J

Explored = {A, B, C, D, E, F, H, I} Frontier = {K}

Step 8 Current Node = K GOTC!

SOLUTION: A → D → K PATH COST = 3