



LINFO 1121

DATA STRUCTURES AND ALGORITHMS



TP3: Arbres de recherche

Question 3.1.1 Sequential vs BINARY SEARCH

	Sequential	Binary
Insertion	$O(n)$	$O(n)$ $O(n/2)$ moyen
Recherche	$O(n)$	$O(\log n)$

n : nombre d'éléments dans l'array

Question 3.1.1 Sequential vs BINARY SEARCH

	Sequential	Binary
Insertion	$O(n)$	$O(n)$ $O(n/2)$ moyen
Recherche	$O(n)$	$O(\log n)$

seq =

bin =

P : Nombre de put

G : Nombre de get

Question 3.1.1 Sequential vs BINARY SEARCH

Coûts liés aux puts

$$\text{seq} = \left(\sum_{i=1}^P i \right)$$

$$\text{bin} = \left(\sum_{i=1}^P i \right)$$

	Sequential	Binary
Insertion	$O(n)$	$O(n)$ $O(n/2)$ moyen
Recherche	$O(n)$	$O(\log n)$

P : Nombre de put

G : Nombre de get

Question 3.1.1 Sequential vs BINARY SEARCH

Coûts liés aux puts
+ coûts liés aux gets

$$\text{seq} = \left(\sum_{i=1}^P i \right) + GP$$

$$\text{bin} = \left(\sum_{i=1}^P i \right) + G \log P$$

	Sequential	Binary
Insertion	$O(n)$	$O(n)$ $O(n/2)$ moyen
Recherche	$O(n)$	$O(\log n)$

P : Nombre de put

G : Nombre de get

Question 3.1.1 Sequential vs BINARY SEARCH

$$\text{seq} = \left(\sum_{i=1}^P i \right) + GP$$

$$\text{bin} = \left(\sum_{i=1}^P i \right) + G \log P$$

$$GP > G \log P$$

$$\text{seq} > \text{bin}$$

Rappels sur les BSTS

Propriété d'un Binary Search Tree

C'est un arbre :

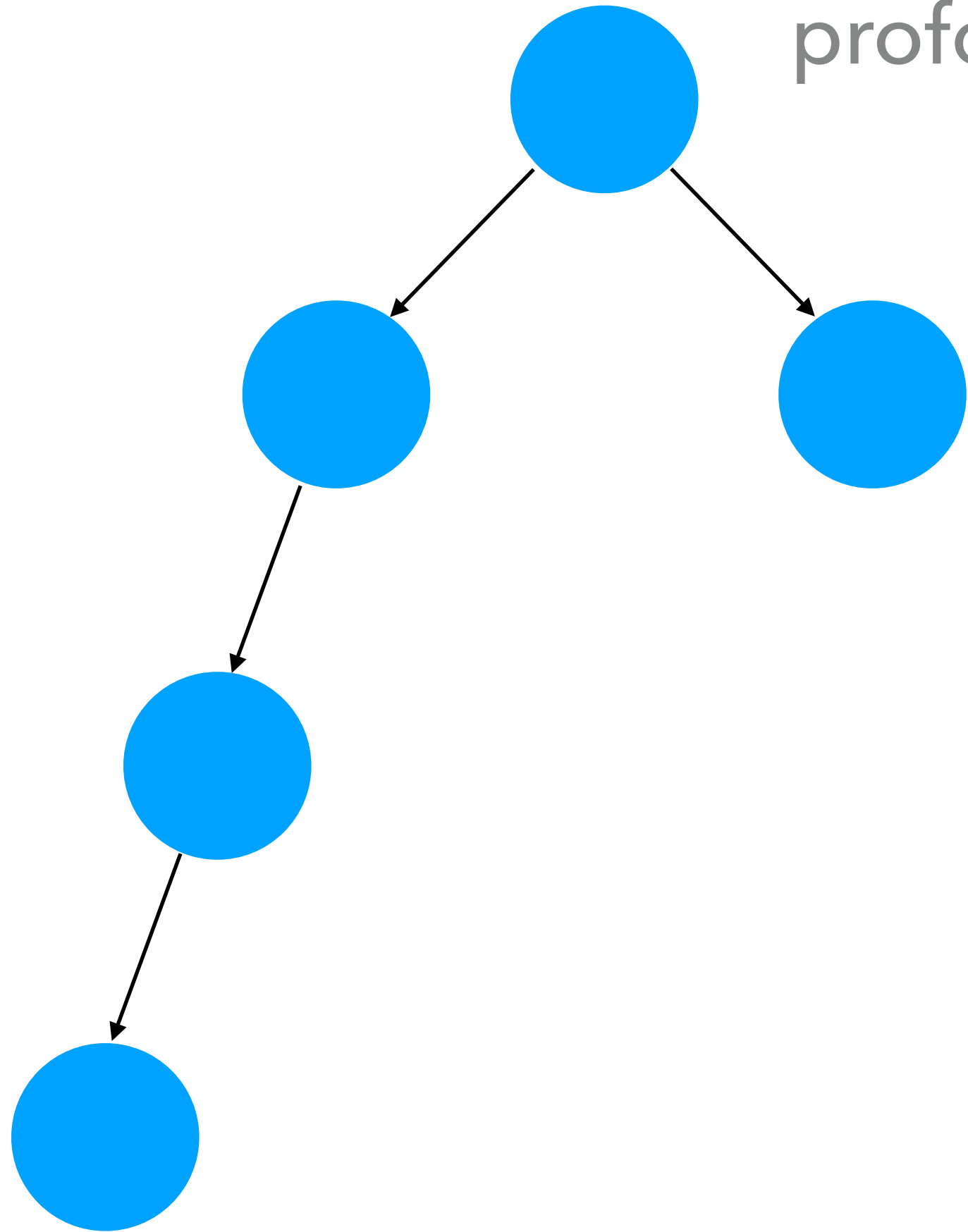
- C'est un graphe
- Connexe
- Possédant $n-1$ arêtes pour n noeuds
- Pas de cycles
- Au plus un chemin entre toute paire de noeuds

Il est binaire :

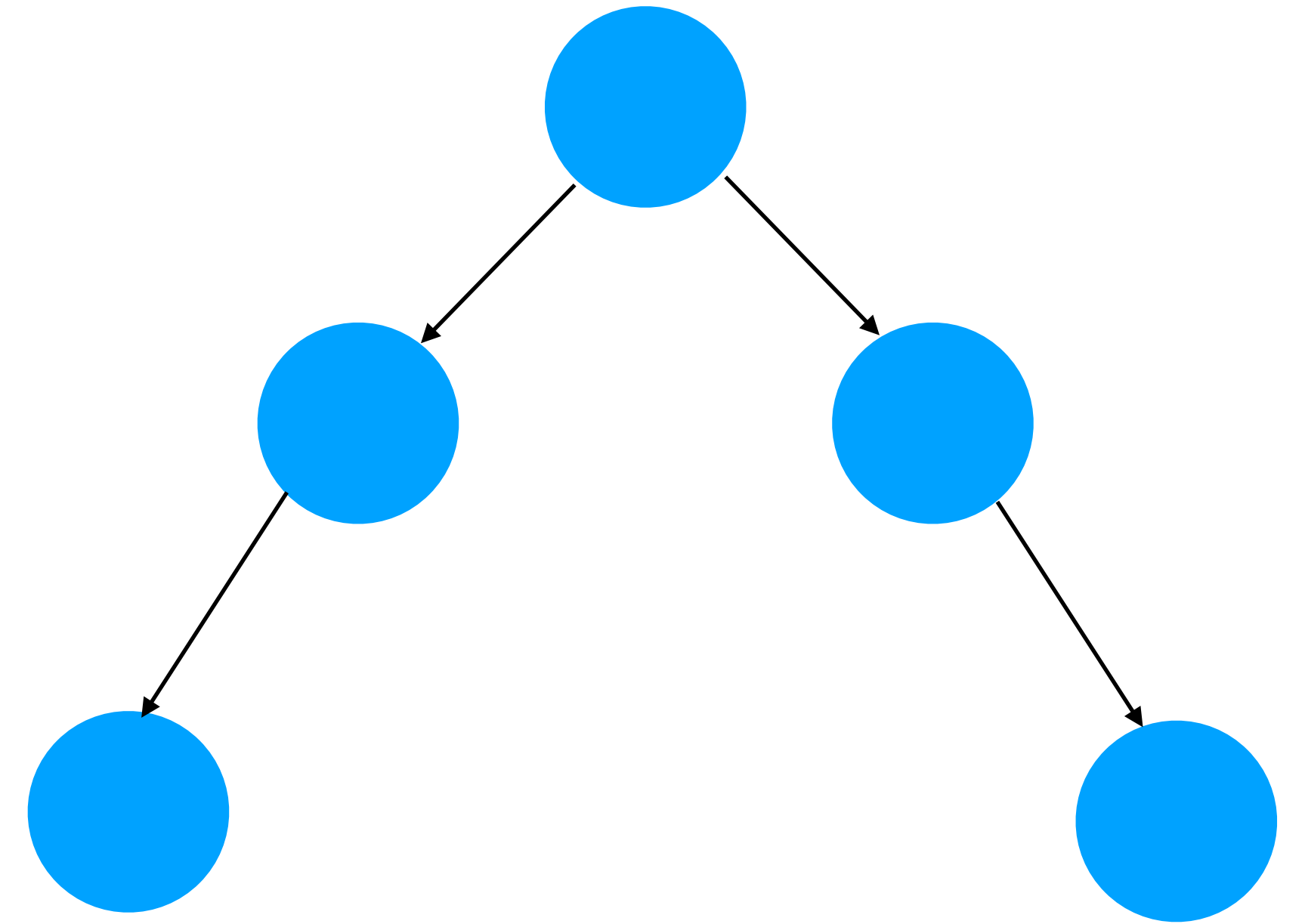
- Deux enfants par noeuds maximum
- Les noeuds en dessous, et à **gauche** doivent avoir des clés plus **petites**
- Les noeuds en dessous, et à **droite** doivent avoir des clés plus **grandes**

Équilibre d'un arbre

Équilibré : toutes les feuilles sont à la même profondeur (+/- 1 au maximum)

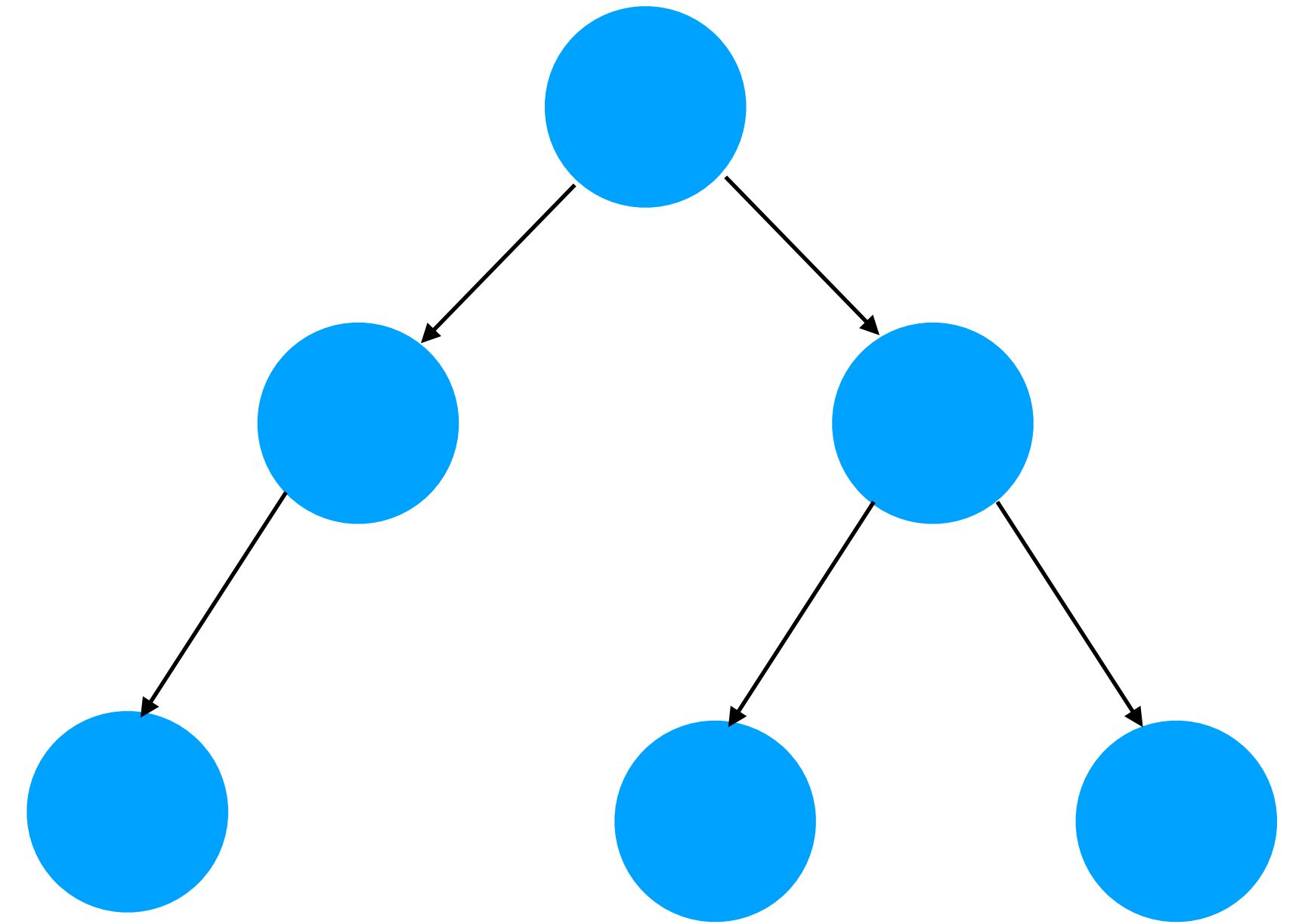


Non équilibré



Équilibré

Équilibre parfait d'un arbre



Parfaitement équilibré si taille des ces chemins est de $\log_2(n) (+ / - 1)$.

3.1.3 Interpolation Search

```
public int rank(Key key) {  
    Key lo = min(Keys)  
    Key hi = max(Keys)  
    while (lo <= hi) {  
        int index = floor((key - lo)/(hi - lo));  
        int cmp = key.compareTo(keys[index]);  
        if (cmp < 0) hi = index - 1;  
        else if (cmp > 0) lo = index + 1;  
        else return index;  
    }  
    return lo;  
}
```

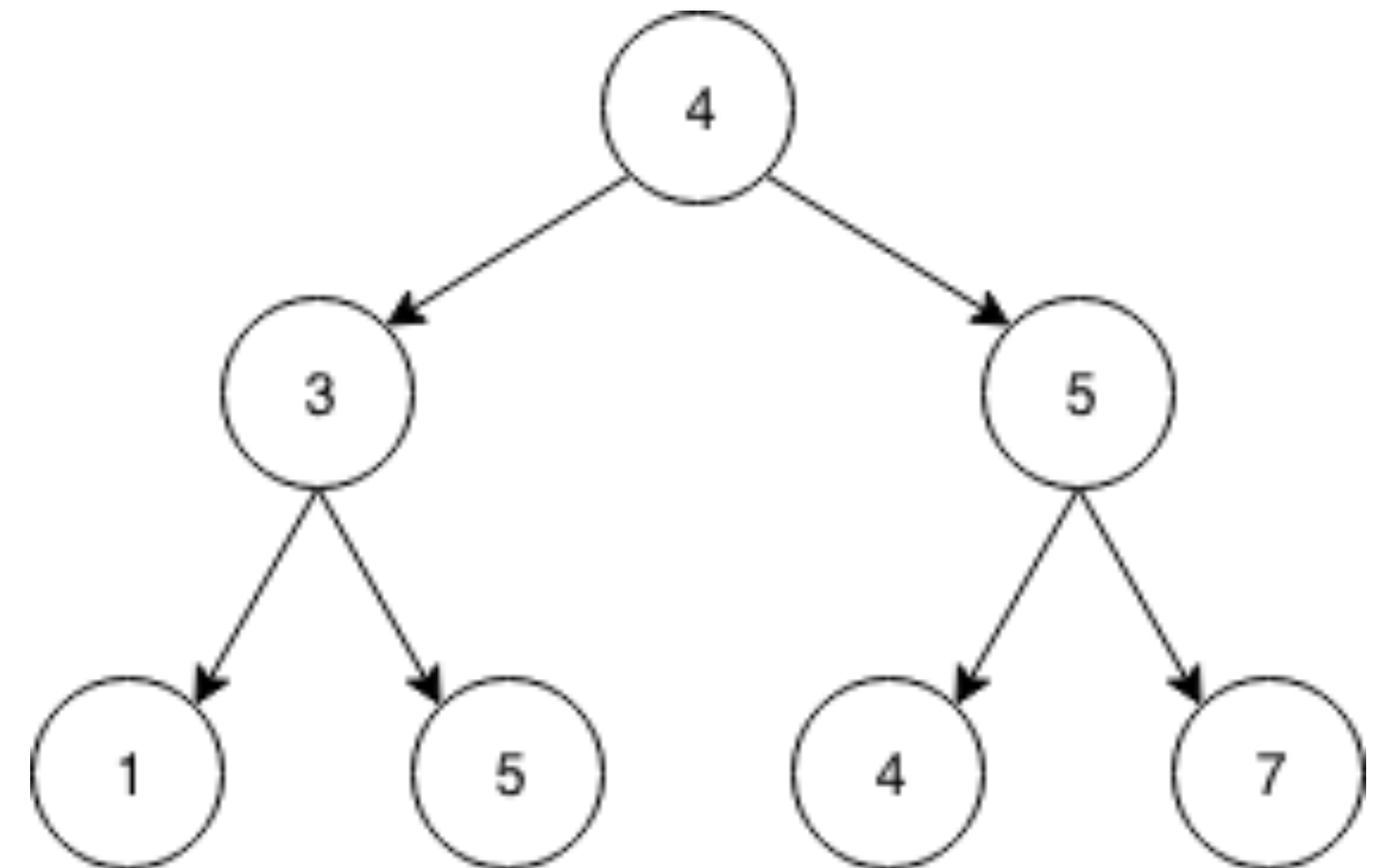
3.1.4 Caching key

```
public class BinarySearchST <Key extends Comparable<Key>, Value> {  
    private Key[] keys;  
    private Value[] vals;  
    private int N;  
    private Key cacheKey;  
    private int cacheRank;  
}
```

```
public int rank(Key key) {  
    if (key.compareTo(cacheKey) == 0)  
        return cacheRank;  
  
    int lo = 0, hi = N-1;  
    while (lo <= hi) {  
        int mid = lo + (hi - lo) / 2;  
        int cmp = key.compareTo(keys[mid]);  
        if (cmp < 0) hi = mid - 1;  
        else if (cmp > 0) lo = mid + 1;  
        else {  
            cacheKey = key;  
            cacheRank = mid;  
            return mid;  
        }  
    }  
    return lo;  
}
```

Question 3.1.5 isBST()

```
private boolean isBST(Node x) {  
    if (x == null) return true;  
    // Est-ce que l'enfant gauche a une plus petite clé ?  
    if (x.key.compareTo(x.left.key) <= 0) return false;  
    // Est-ce que l'enfant droit a une plus grande clé ?  
    if (x.key.compareTo(x.right.key) >= 0) return false;  
    return isBST(x.left) && isBST(x.right);  
}
```



Question 3.1.5 isBST()

```
private boolean isBST() {  
    return isBST(root, null, null);  
}
```

Ajout de bornes supérieures et inférieures



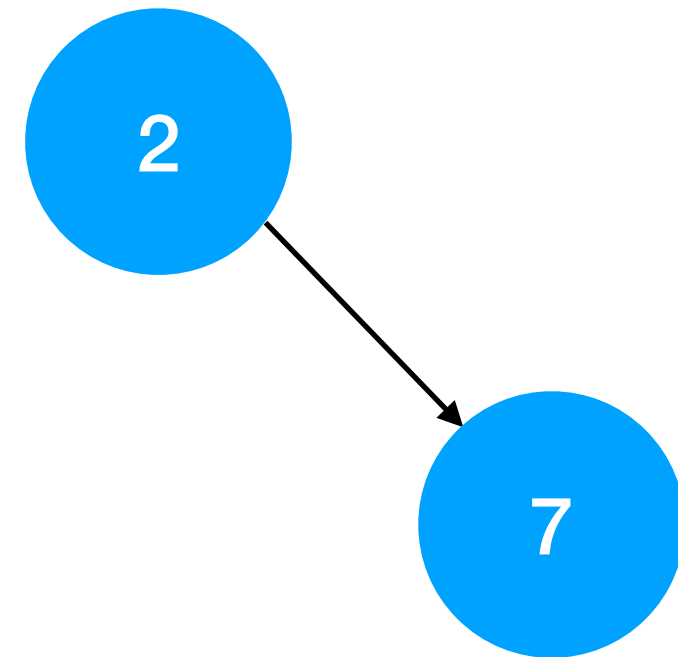
```
private boolean isBST(Node x, Key min, Key max) {  
    if (x == null) return true;  
    if (min != null && x.key.compareTo(min) <= 0) return false;  
    if (max != null && x.key.compareTo(max) >= 0) return false;  
    return isBST(x.left, min, x.key) && isBST(x.right, x.key, max);  
}
```

Question 3.1.6 VISITE POSSIBLES EN DFS

- 10,9,8,7,6,5
- 4,10,8,6,5
- 1,10,2,9,3,8,4,7,6,5
- 2,7,3,8,4,5
- 1,2,10,4,8,5

Question 3.1.6 VISITE POSSIBLES EN DFS

2,7,3,8,4,5



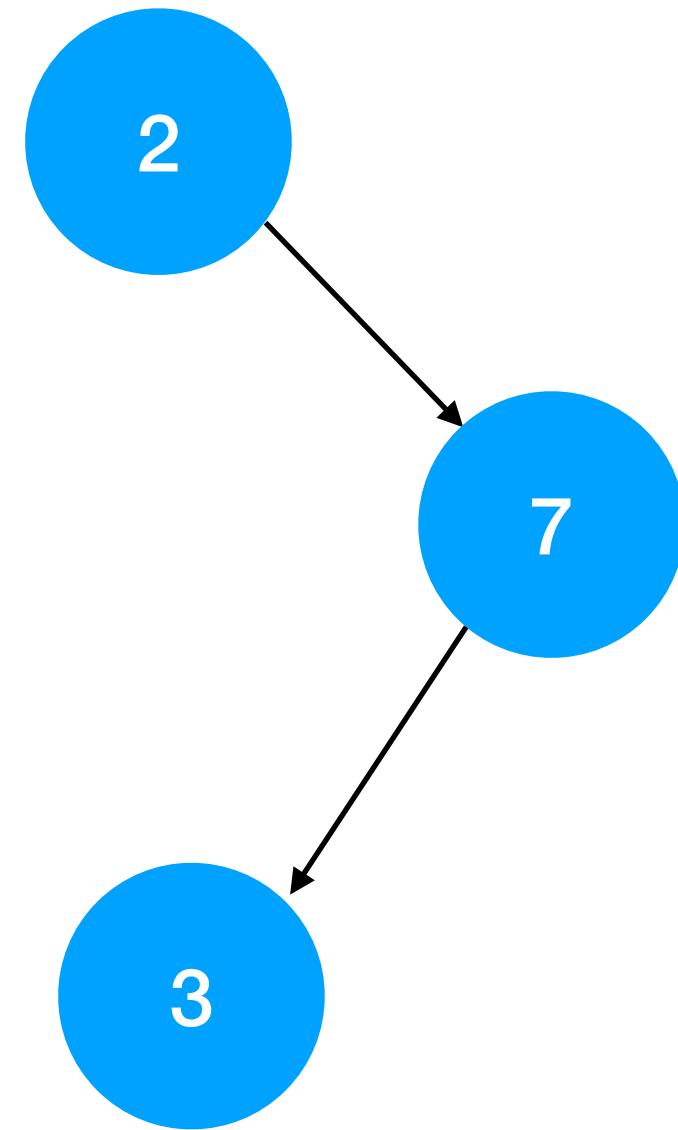
$$LB = -\infty$$

$$UB = +\infty$$

$$7 > 2 \rightarrow LB = 2$$

Question 3.1.6 VISITE POSSIBLES EN DFS

2,7,3,8,4,5



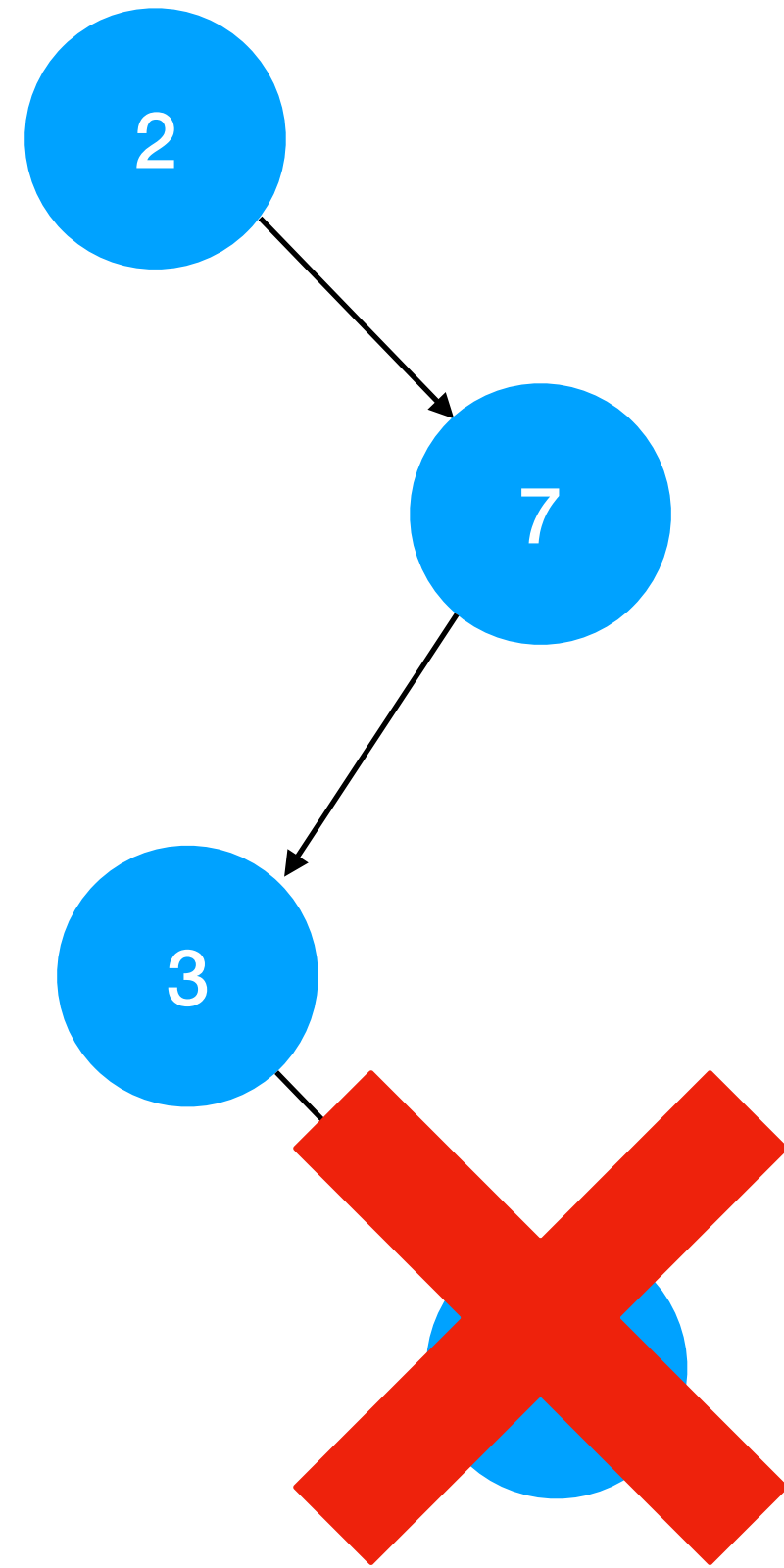
$$LB = 2$$

$$UB = +\infty$$

$$3 < 7 \rightarrow UB = 7$$

Question 3.1.6 VISITE POSSIBLES EN DFS

2,7,3,8,4,5



LB = 2
UB = 7

$8 > 7 \rightarrow 8 > \text{UB}$

Question 3.1.6 VISITE POSSIBLES EN DFS

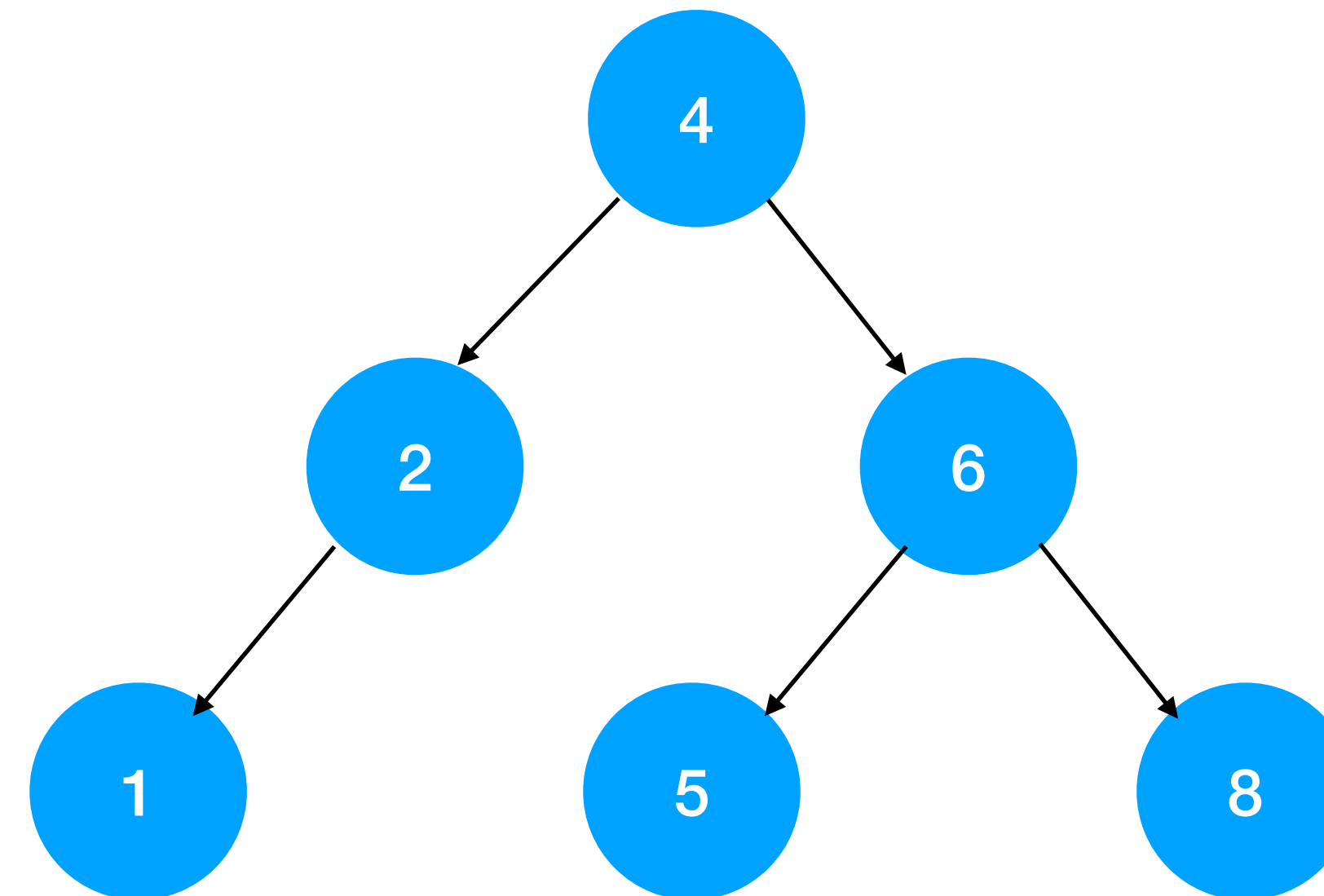
- 10,9,8,7,6,5 ✓
- 4,10,8,6,5 ✓
- 1,10,2,9,3,8,4,7,6,5 ✓
- 2,7,3,8,4,5 ✗
- 1,2,10,4,8,5 ✓

Question 3.1.8 Énumérer en ordre croissant les clés

Parcours infixe

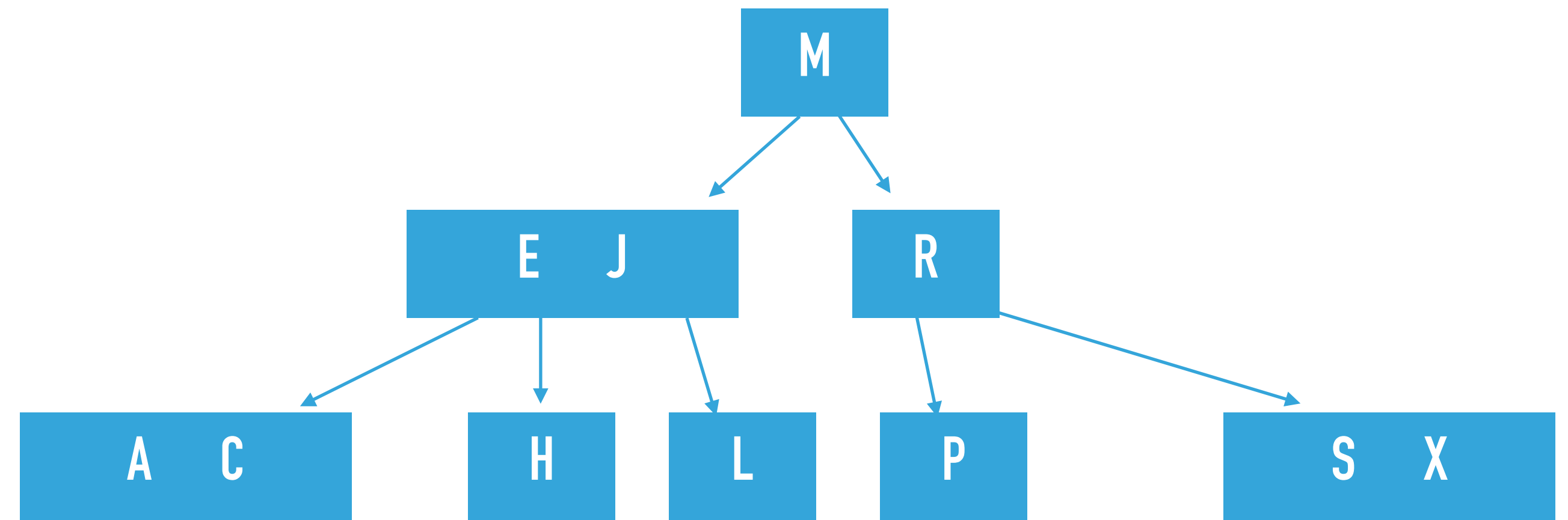
Complexité : $O(\text{nombre de noeuds})$

```
public static void enumerate(Node parent) {  
    enumerate(parent.leftChild)  
    System.out.println(parent.key)  
    enumerate(parent.rightChild)  
}
```



Arbres 2-3

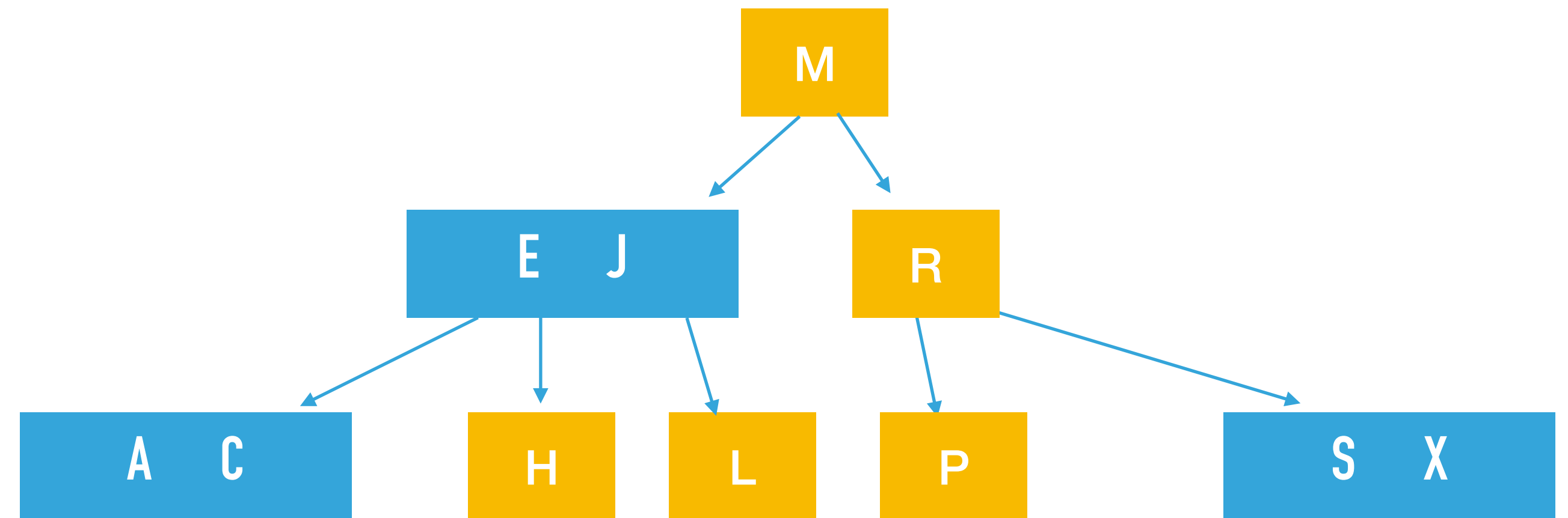
Arbre 2-3 contient soit :



Arbres 2-3

Arbre 2-3 contient soit :

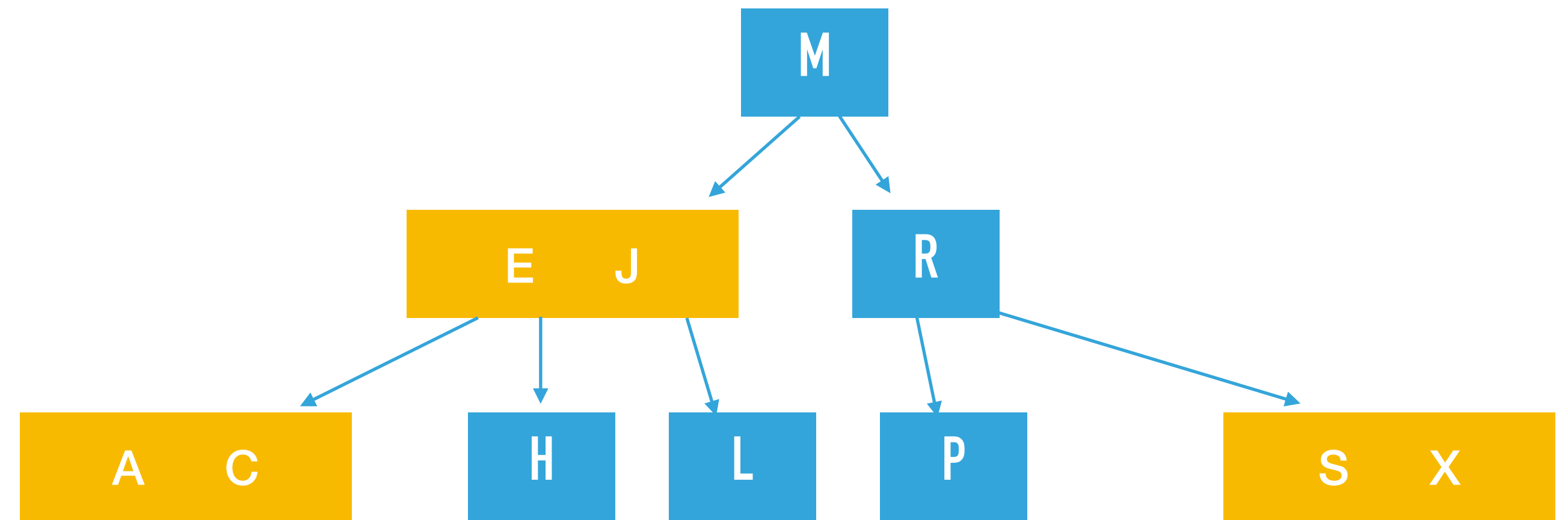
- 2-noeud, avec 1 clé et deux liens
- À gauche : clés plus petites
- À droite : clés plus grandes



Arbres 2-3

Arbre 2-3 contient soit :

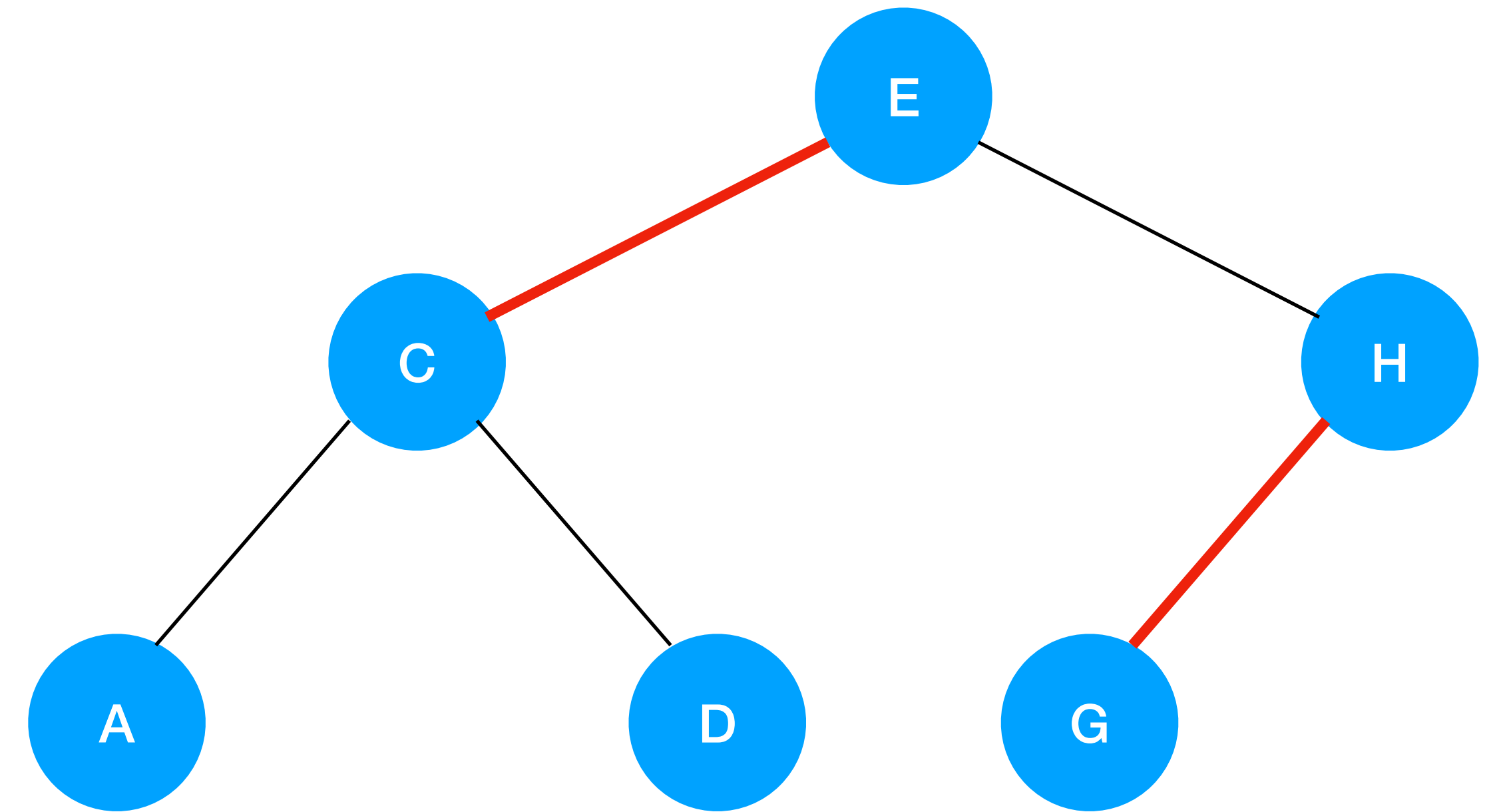
- 2-noeud, avec 1 clé et deux liens
 - À gauche : clés plus petites
 - À droite : clés plus grandes
- 3-noeud, avec 2 clés et 3 liens
 - À gauche : clés plus petites
 - À droite : clés plus grandes
 - Au milieu : clés entre



Arbre Red-Black

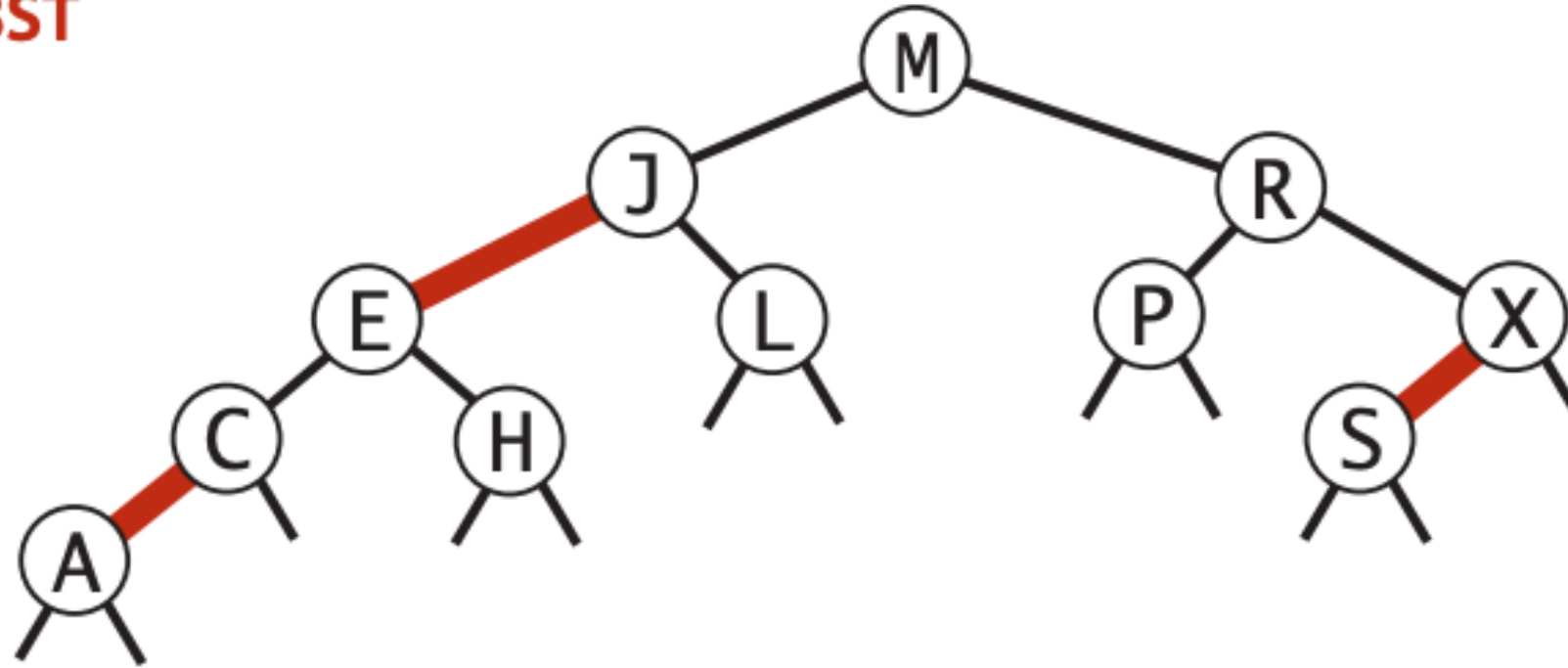
Arbre Red-Black :

- 2 types de liens (**rouge** ou **noir**)
- Liens **rouges** tjs à **gauche**
- **Pas** deux liens **rouges d'affilées**
- **Equilibre parfait** sur les liens **noirs**

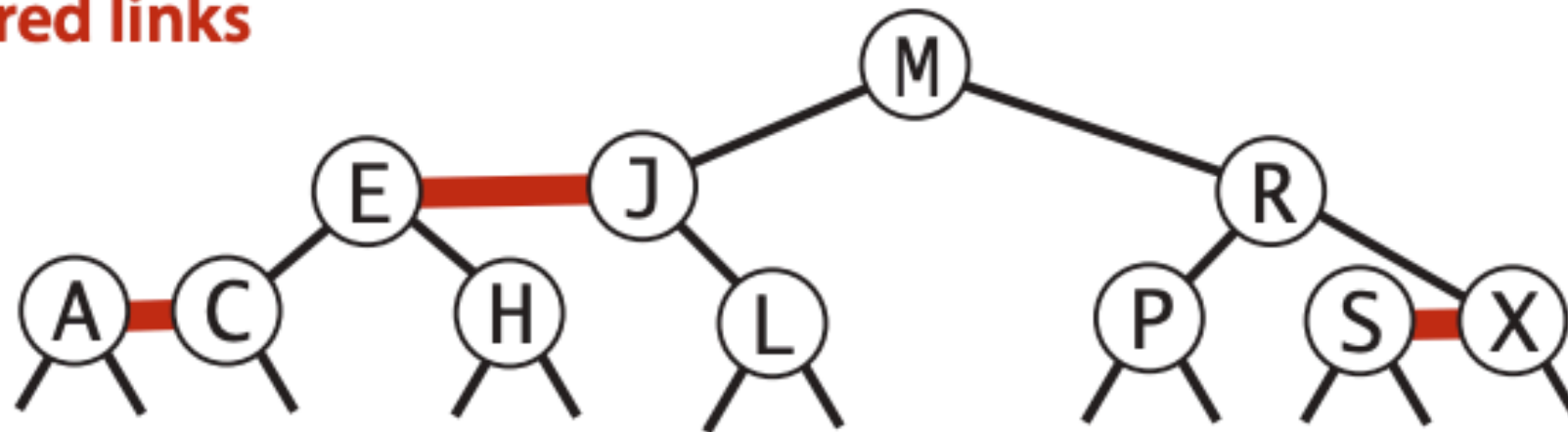


Correspondance 2-3 et Red-Black

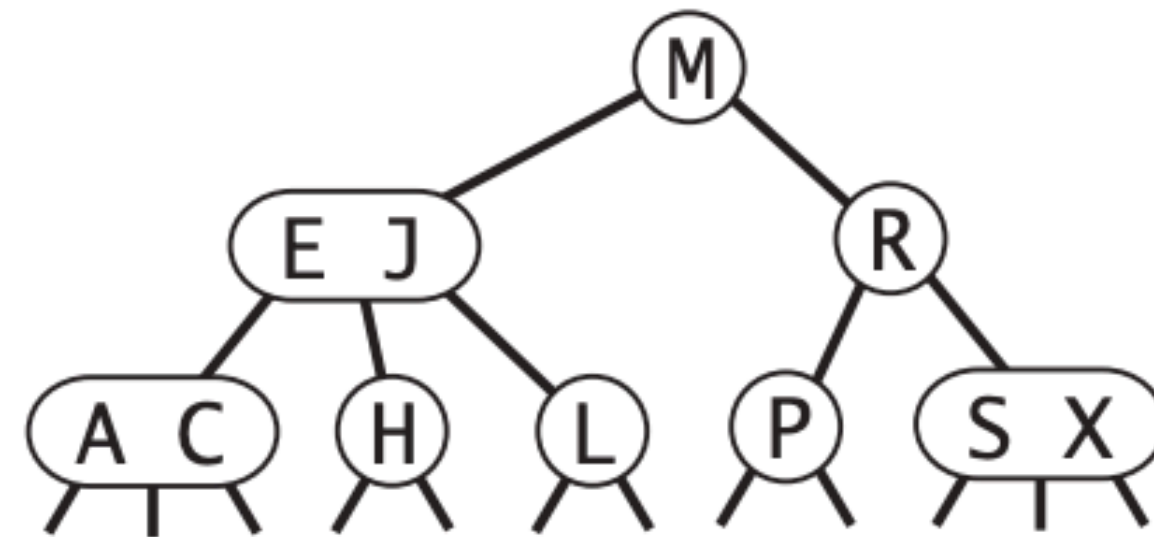
red-black BST



horizontal red links



2-3 tree



Question 3.1.9 insertions

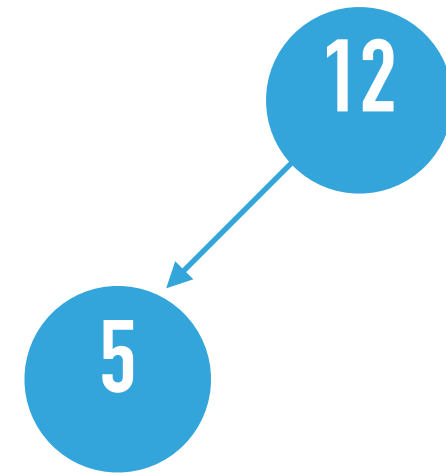
12, 5, 10, 3, 13, 14, 15, 17, 18, 15

Question 3.1.9 insertions

12

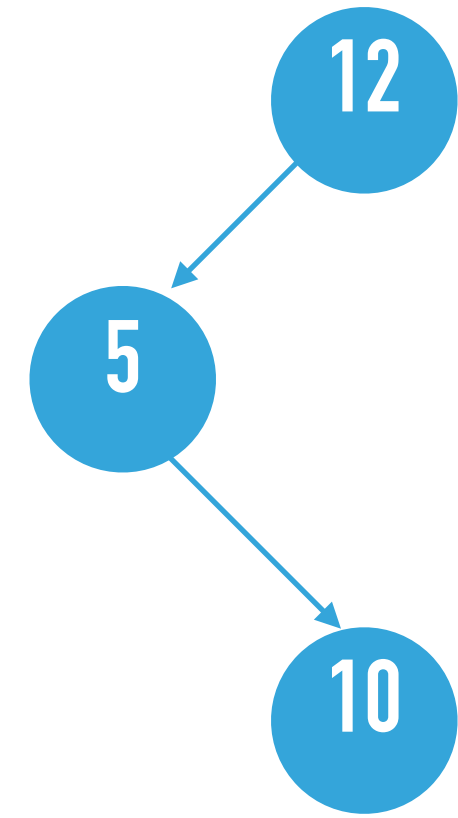
~~12~~, 5, 10, 3, 13, 14, 15, 17, 18, 15

Question 3.1.9 insertions



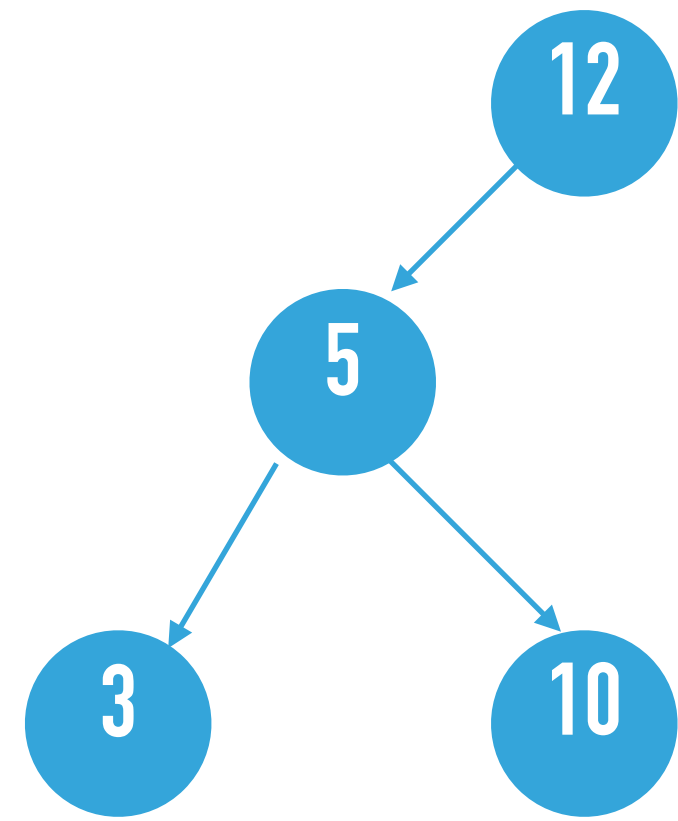
~~12, 5~~, 10, 3, 13, 14, 15, 17, 18, 15

Question 3.1.9 insertions



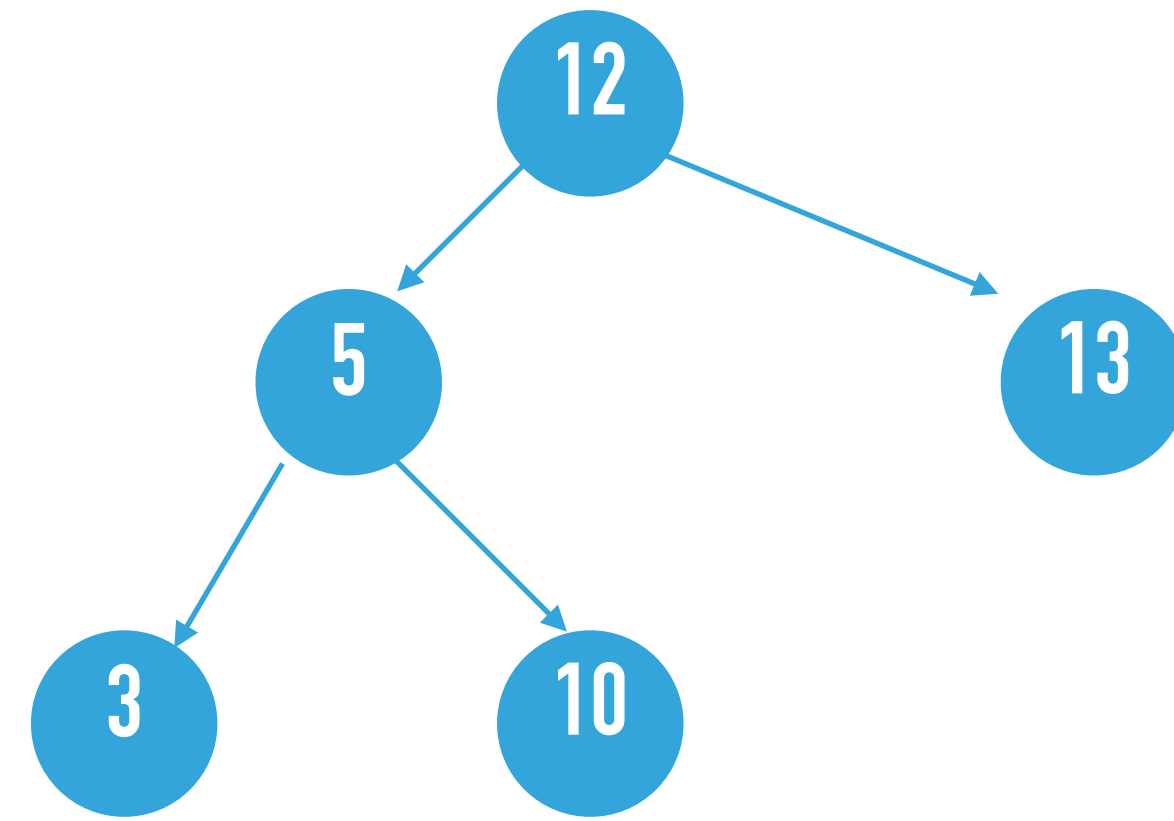
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



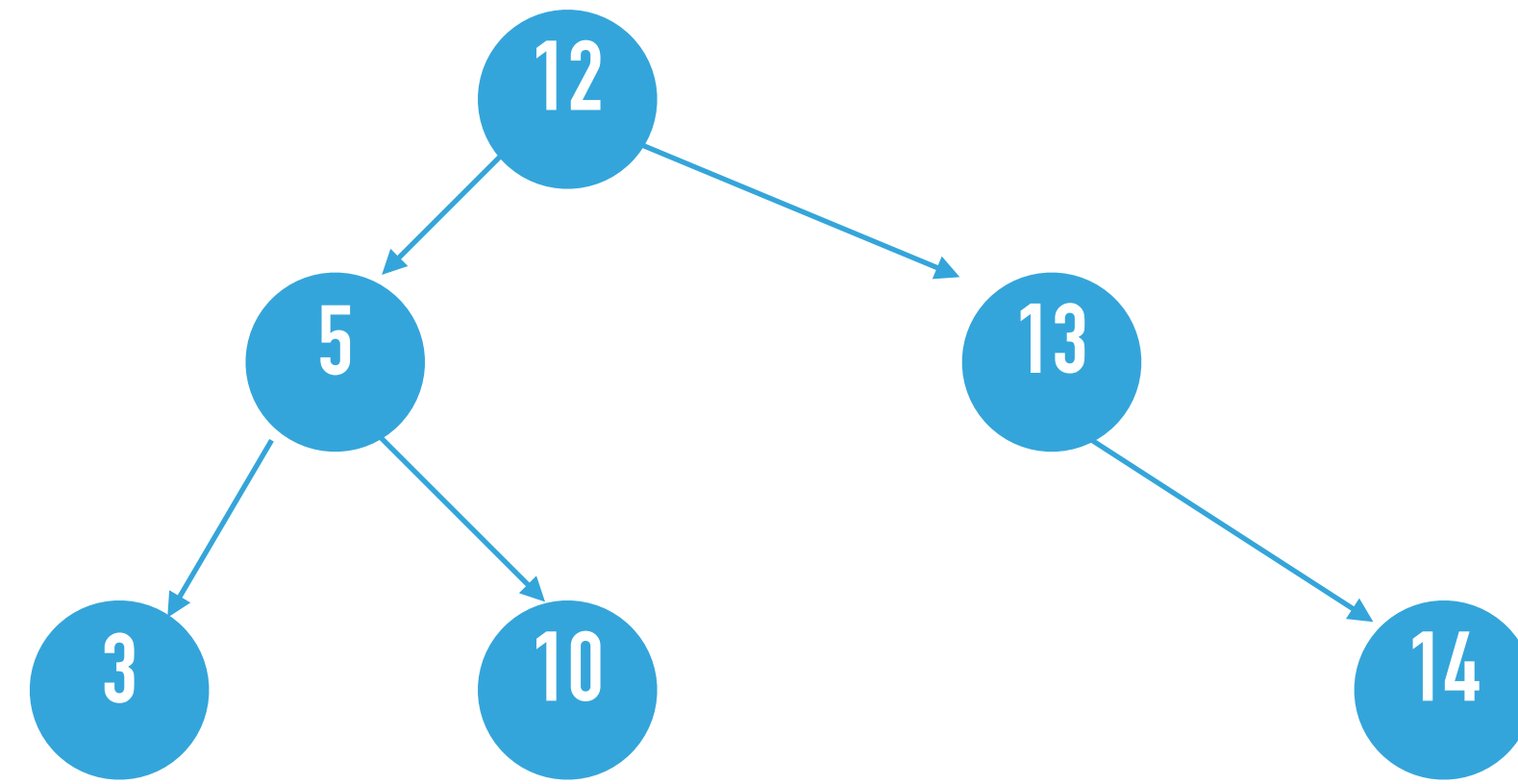
~~12, 5, 10, 3~~, 13, 14, 15, 17, 18, 15

Question 3.1.9 insertions



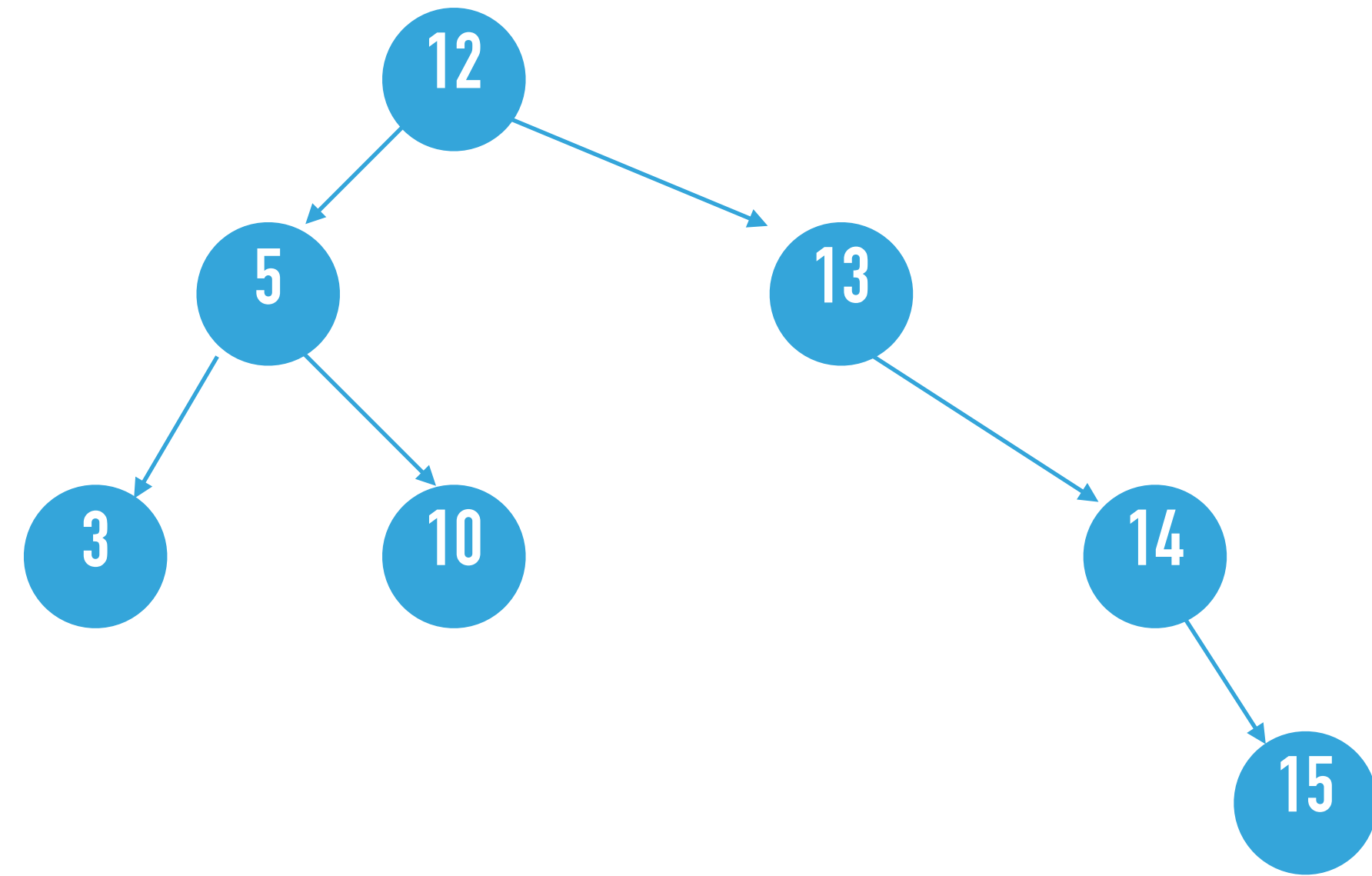
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



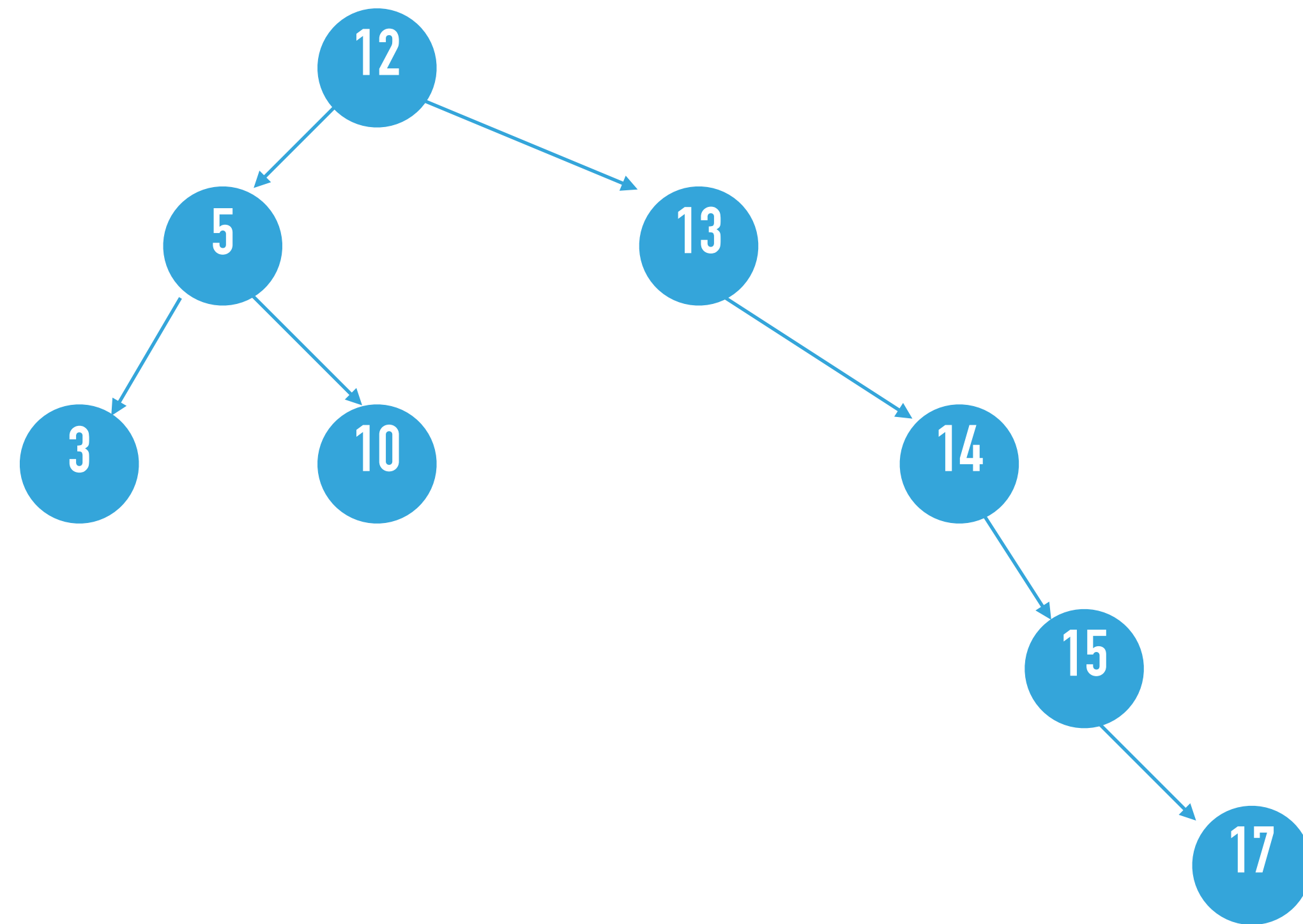
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



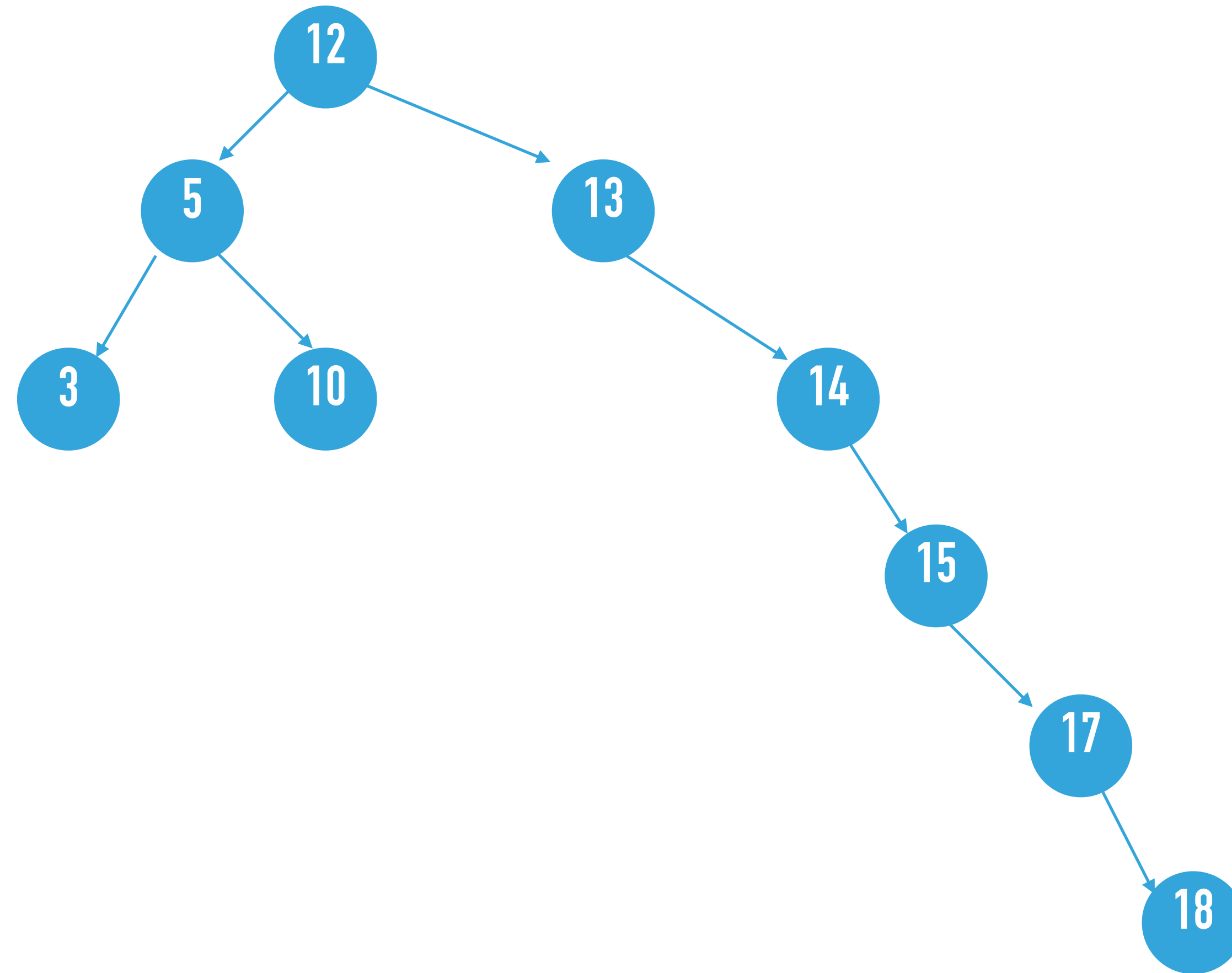
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



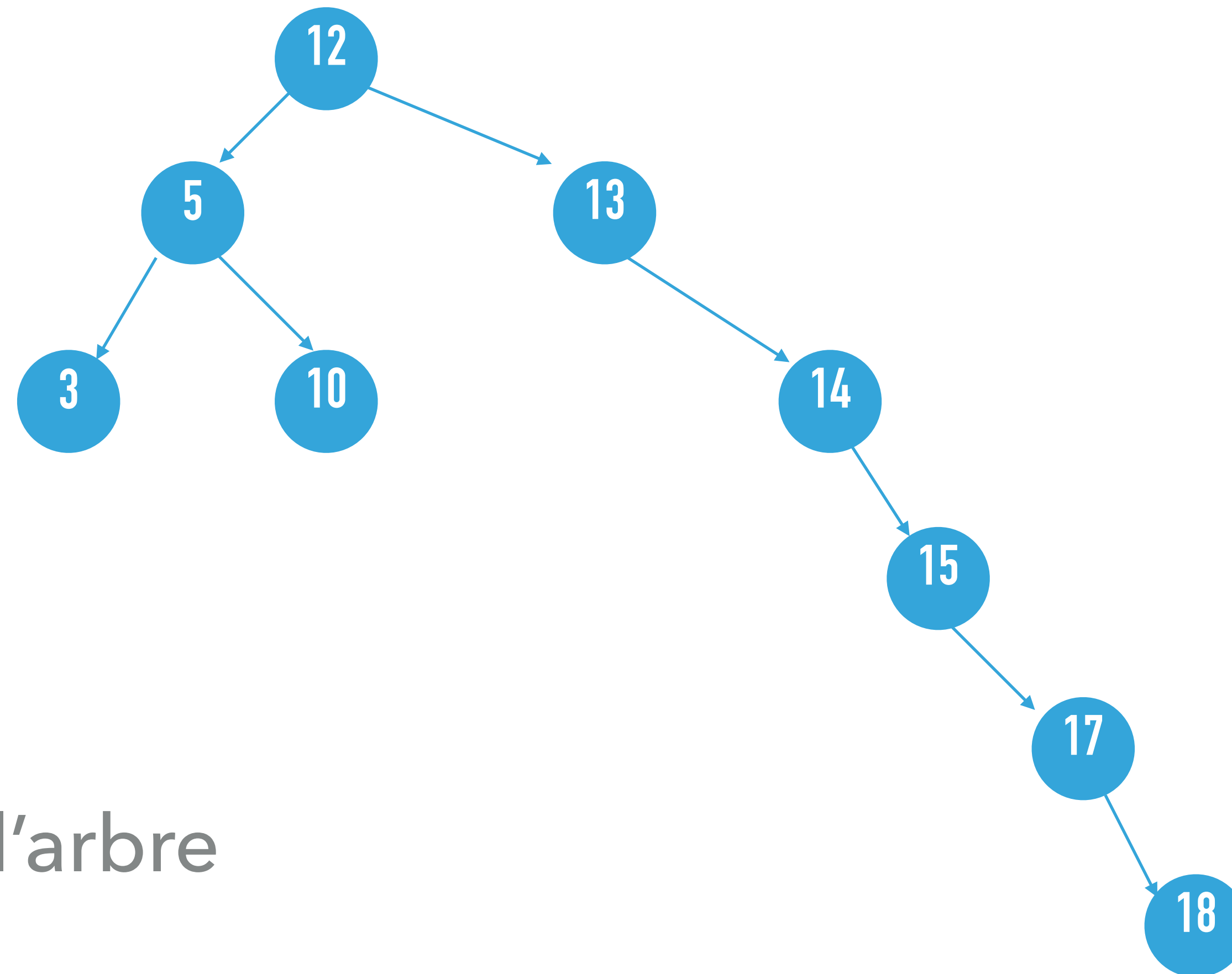
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



15 est déjà dans l'arbre

~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions

12

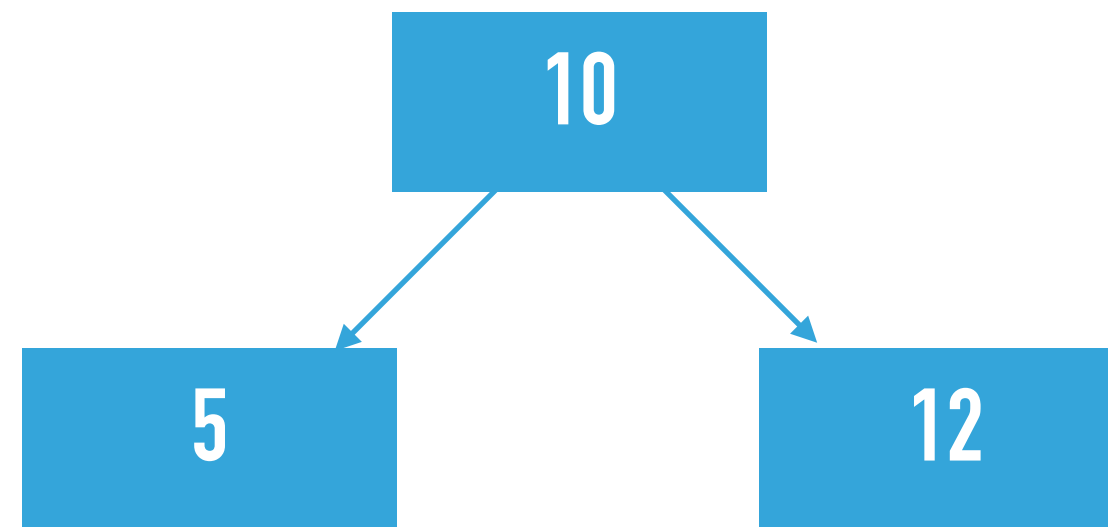
~~12~~, 5, 10, 3, 13, 14, 15, 17, 18, 15

Question 3.1.9 insertions

5 12

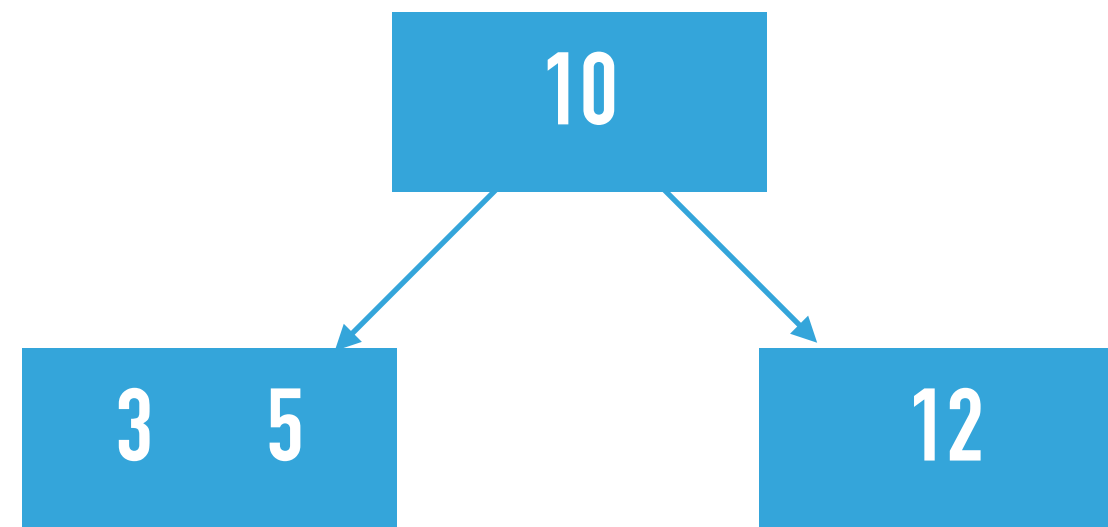
~~12~~, 5, 10, 3, 13, 14, 15, 17, 18, 15

Question 3.1.9 insertions



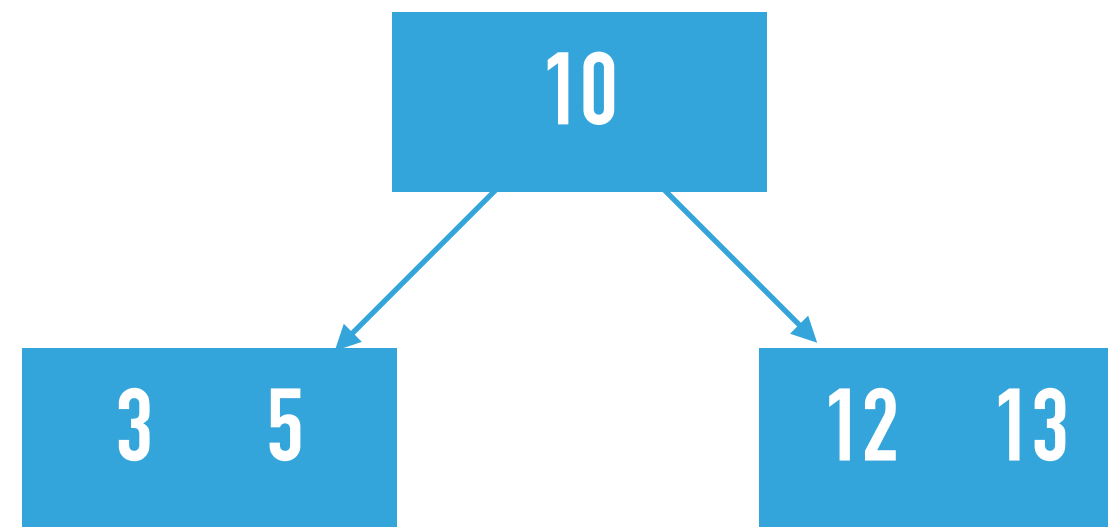
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



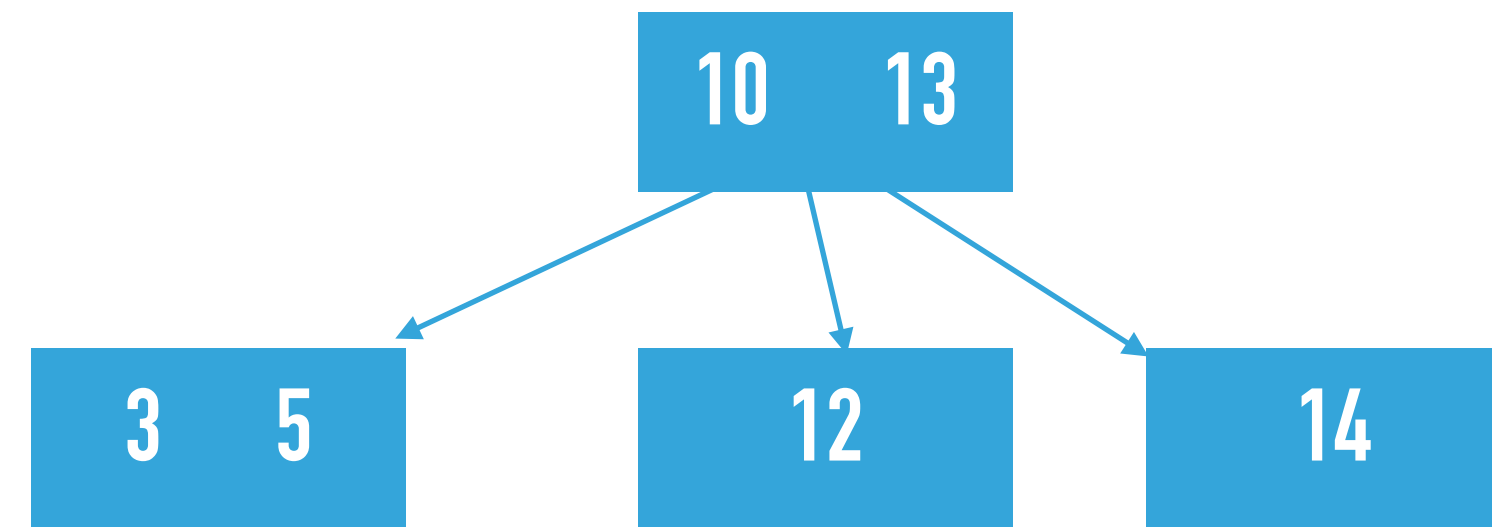
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



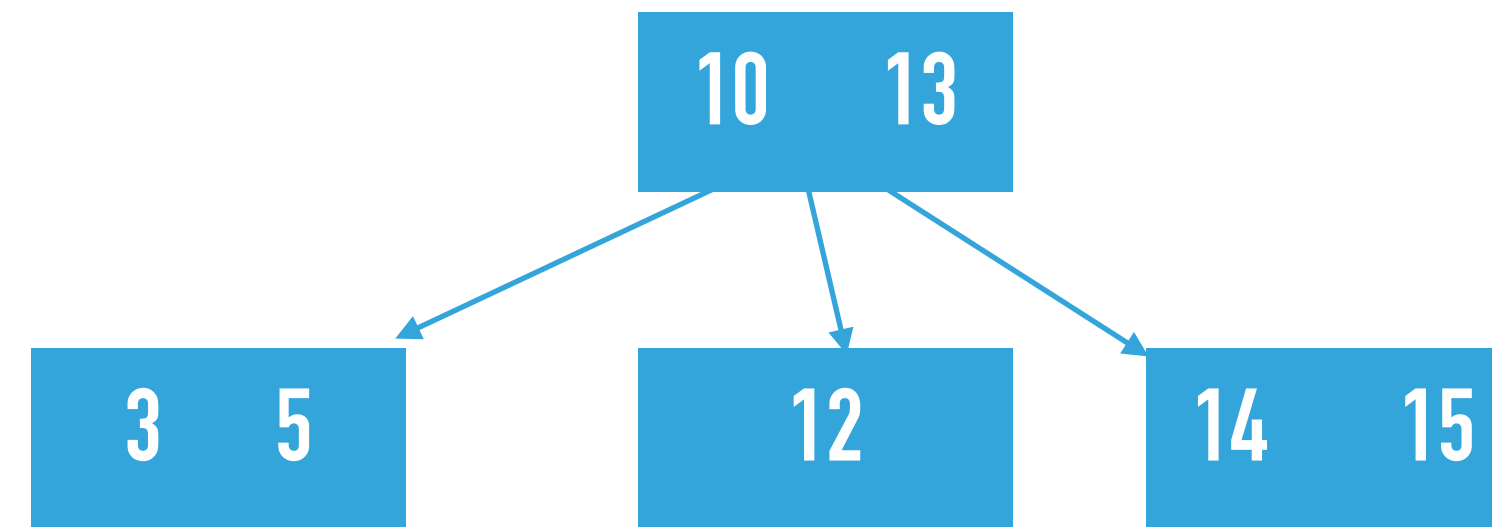
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



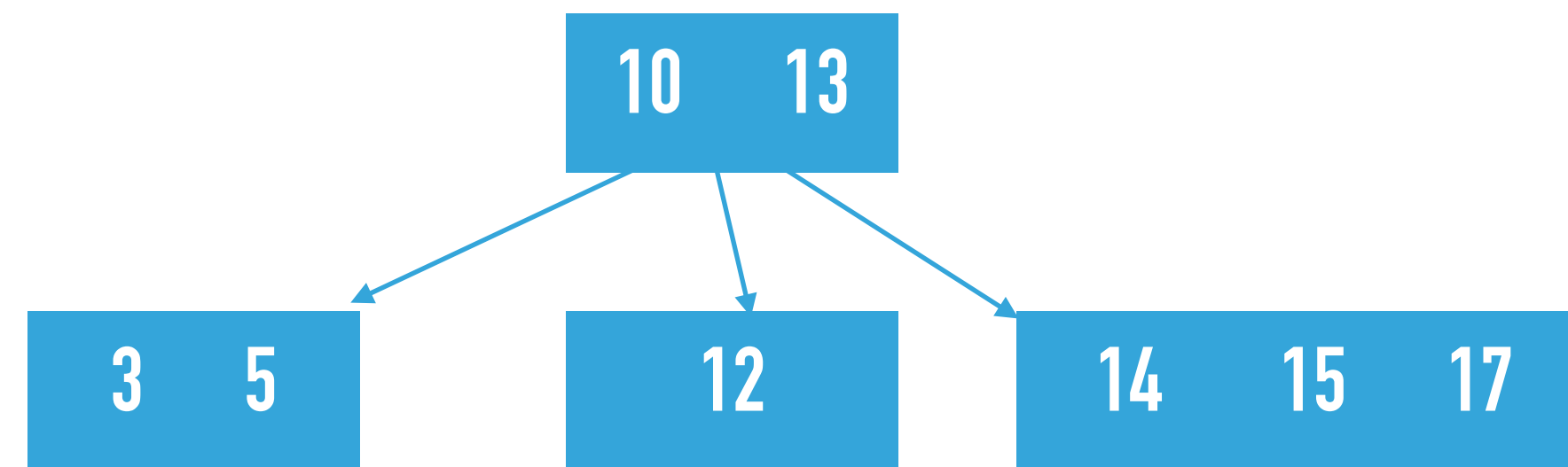
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



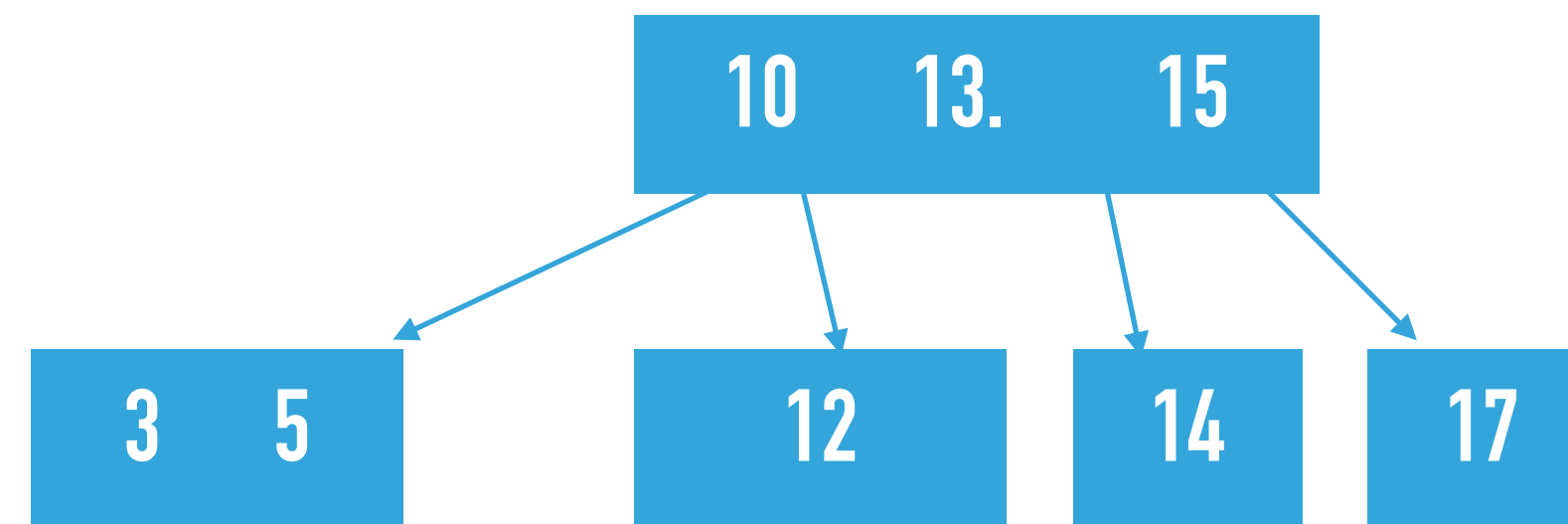
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



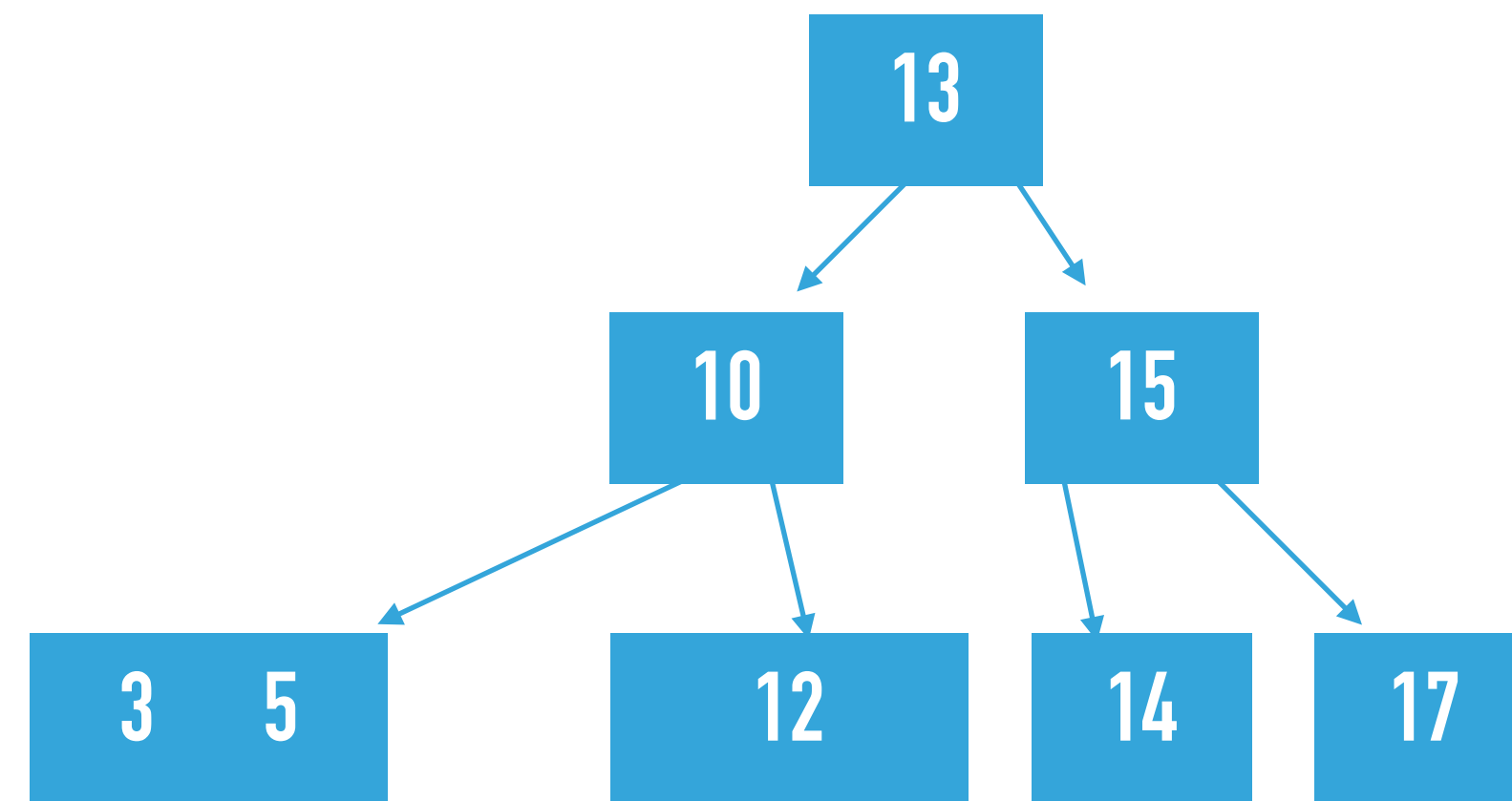
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



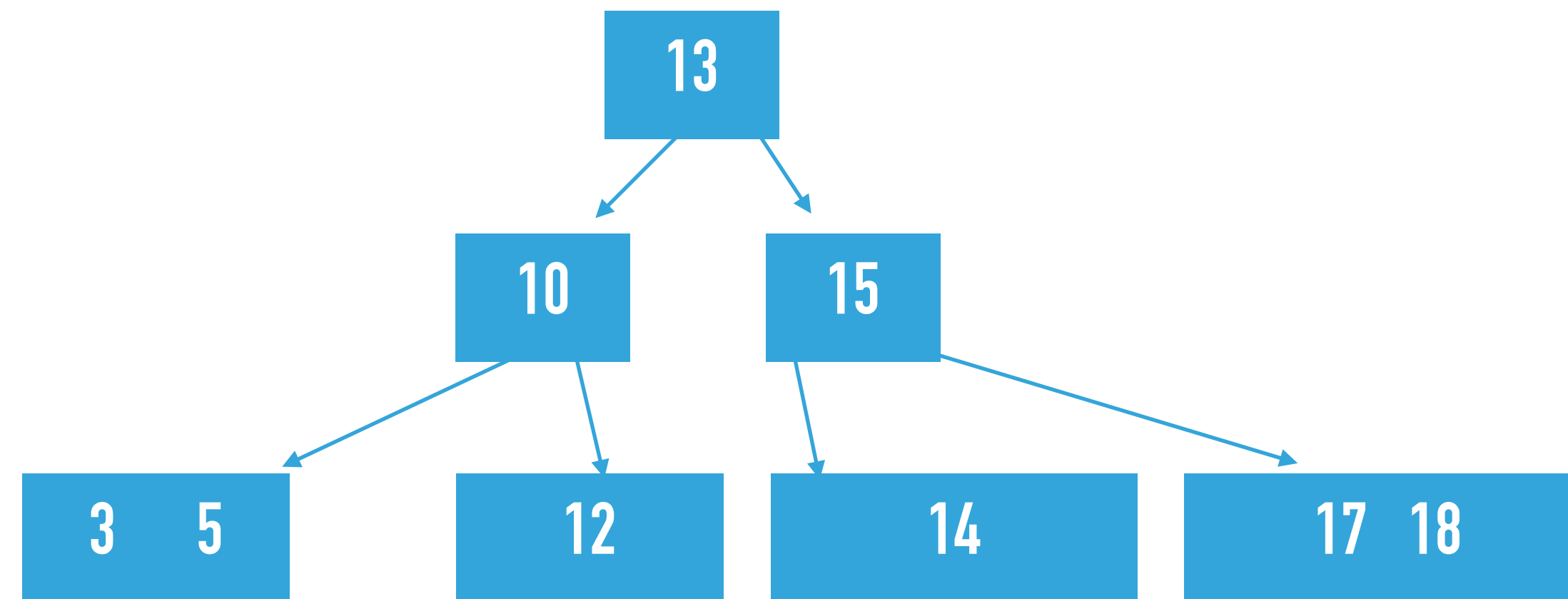
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



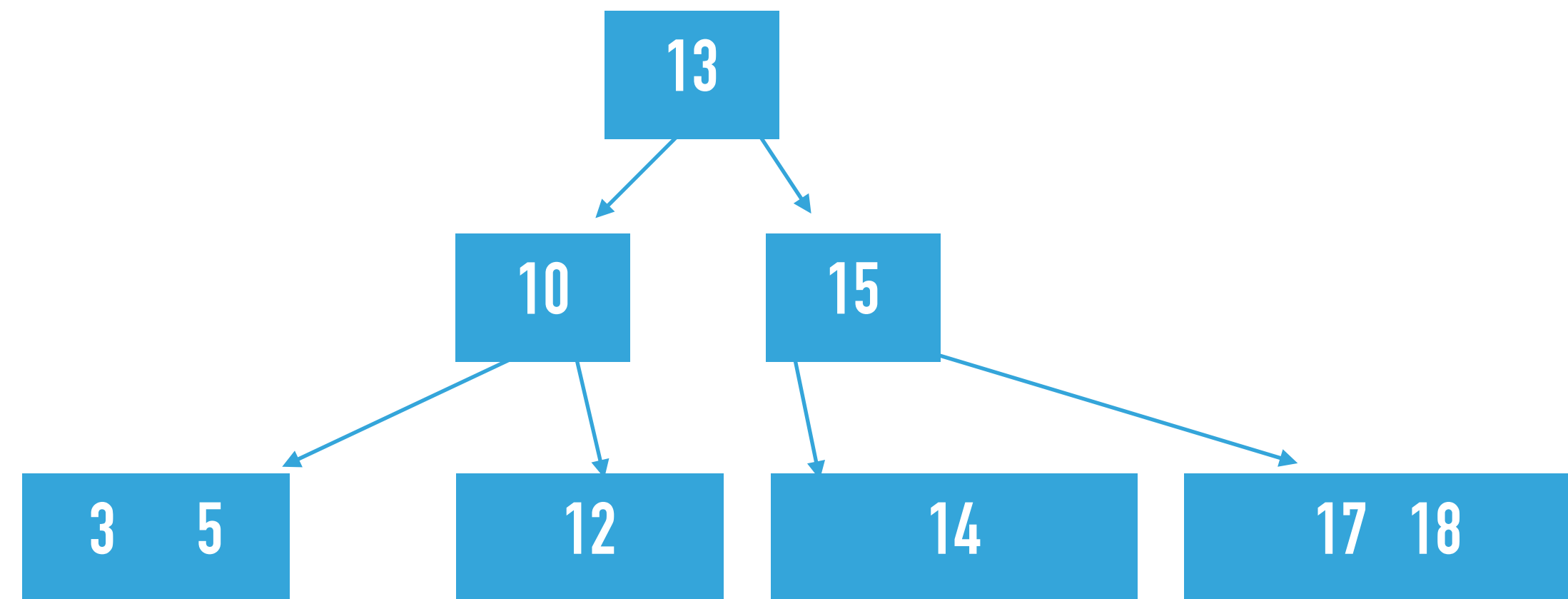
~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

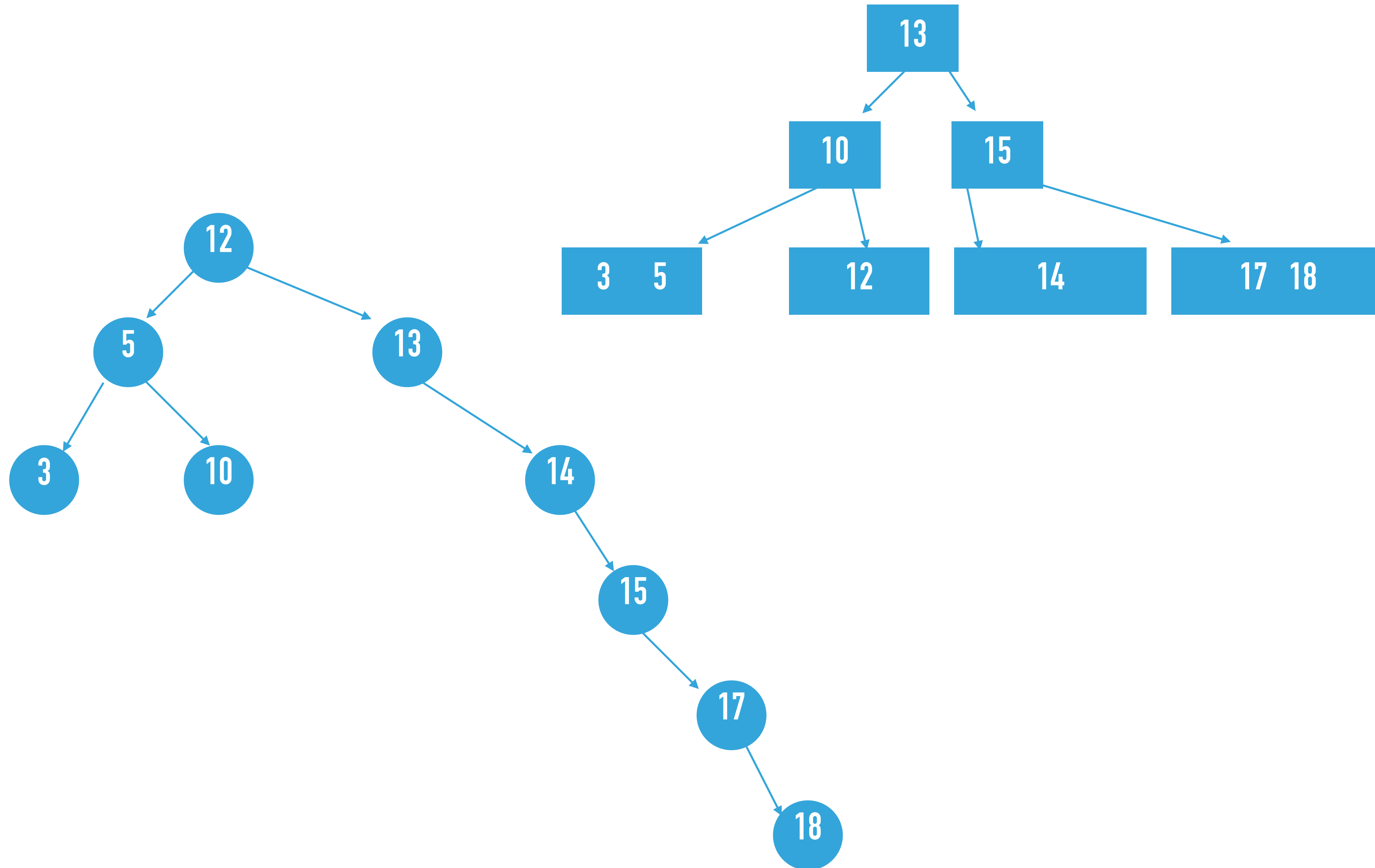
Question 3.1.9 insertions



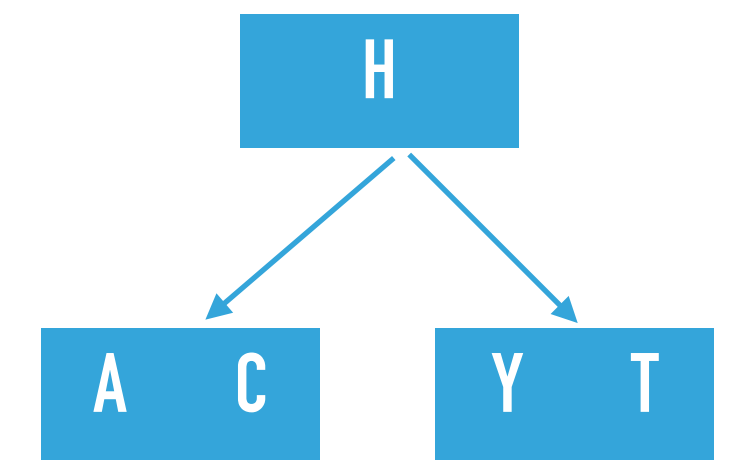
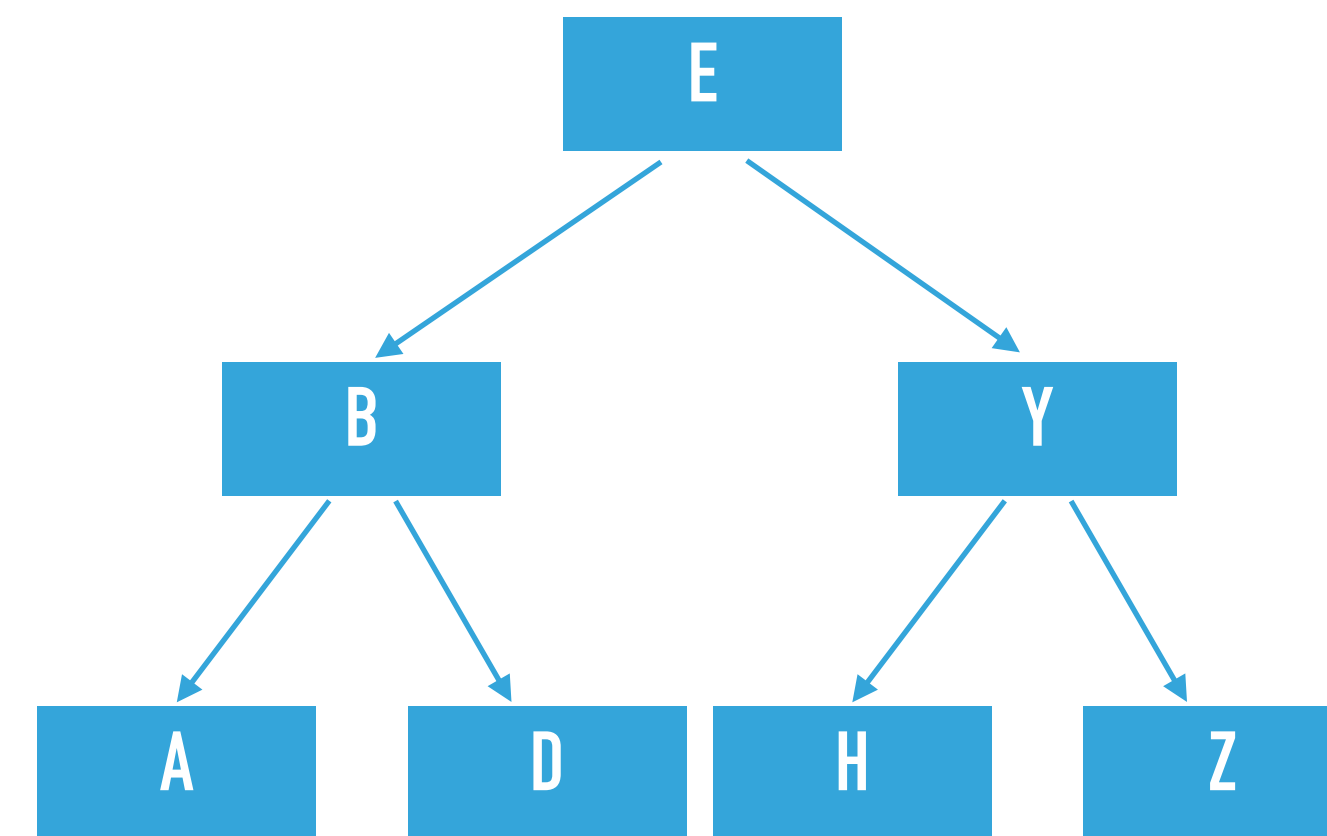
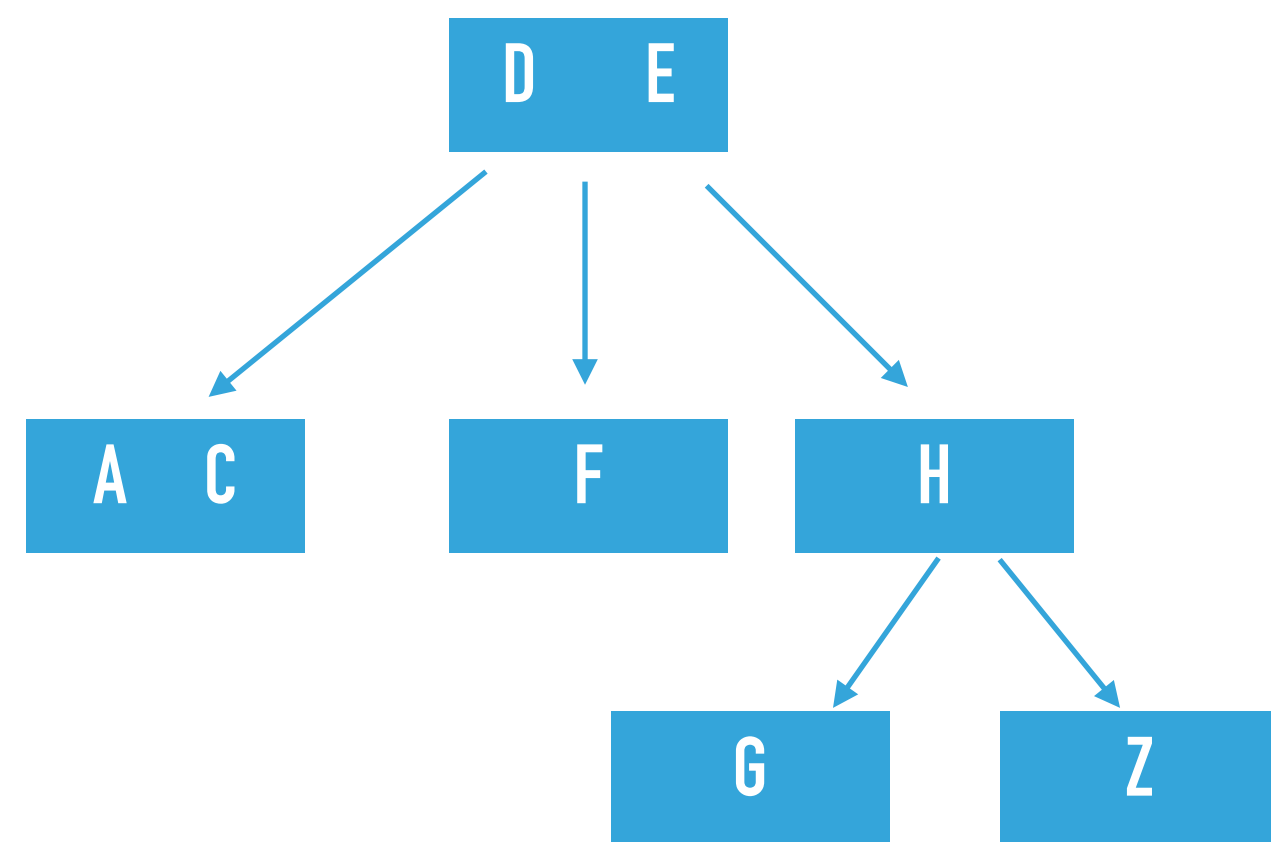
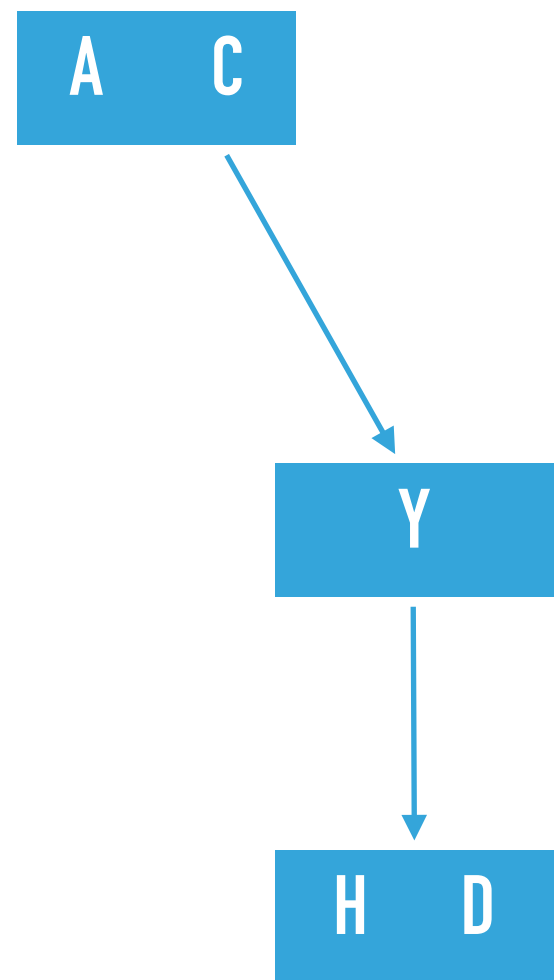
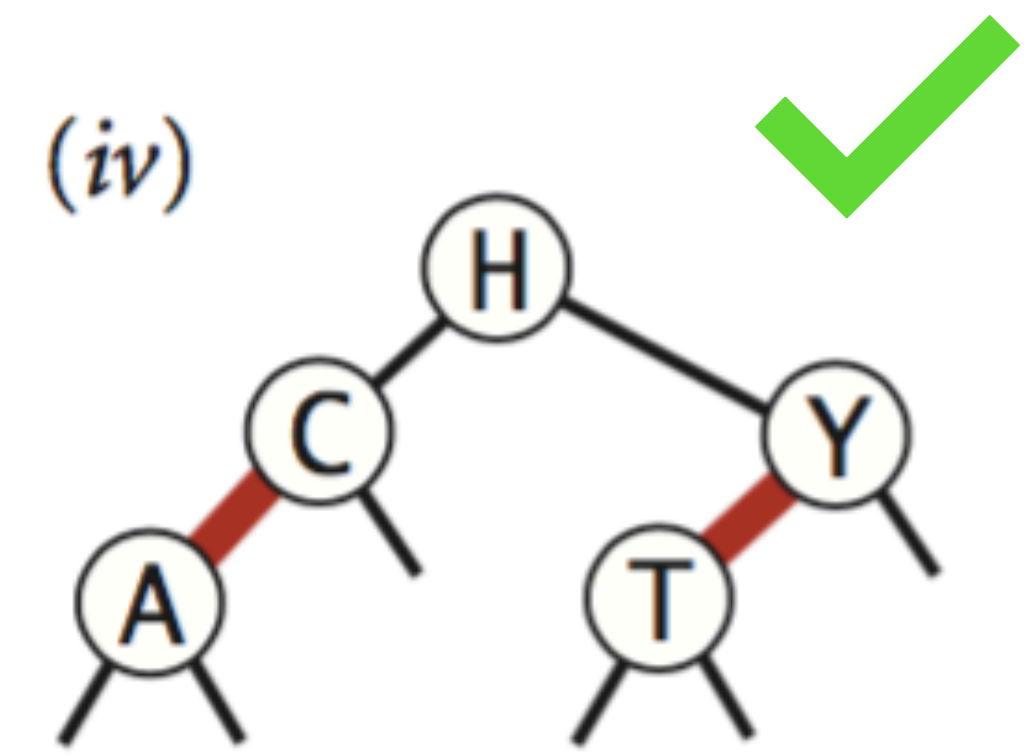
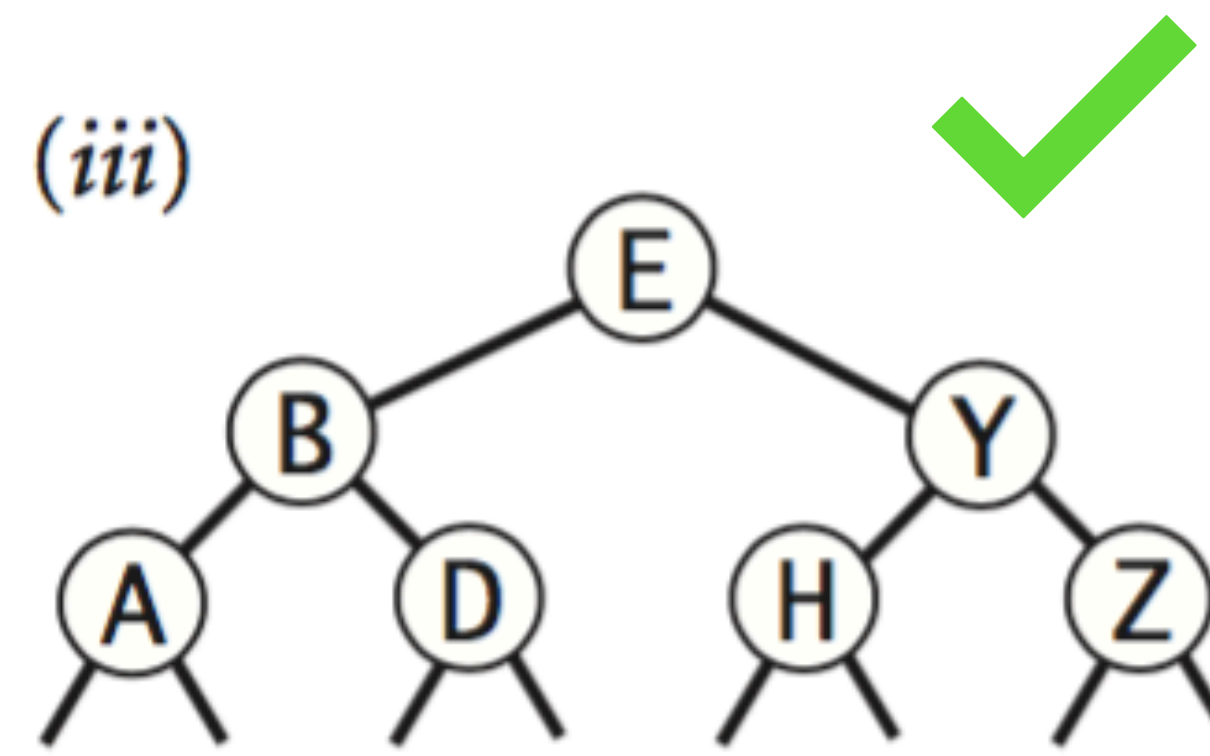
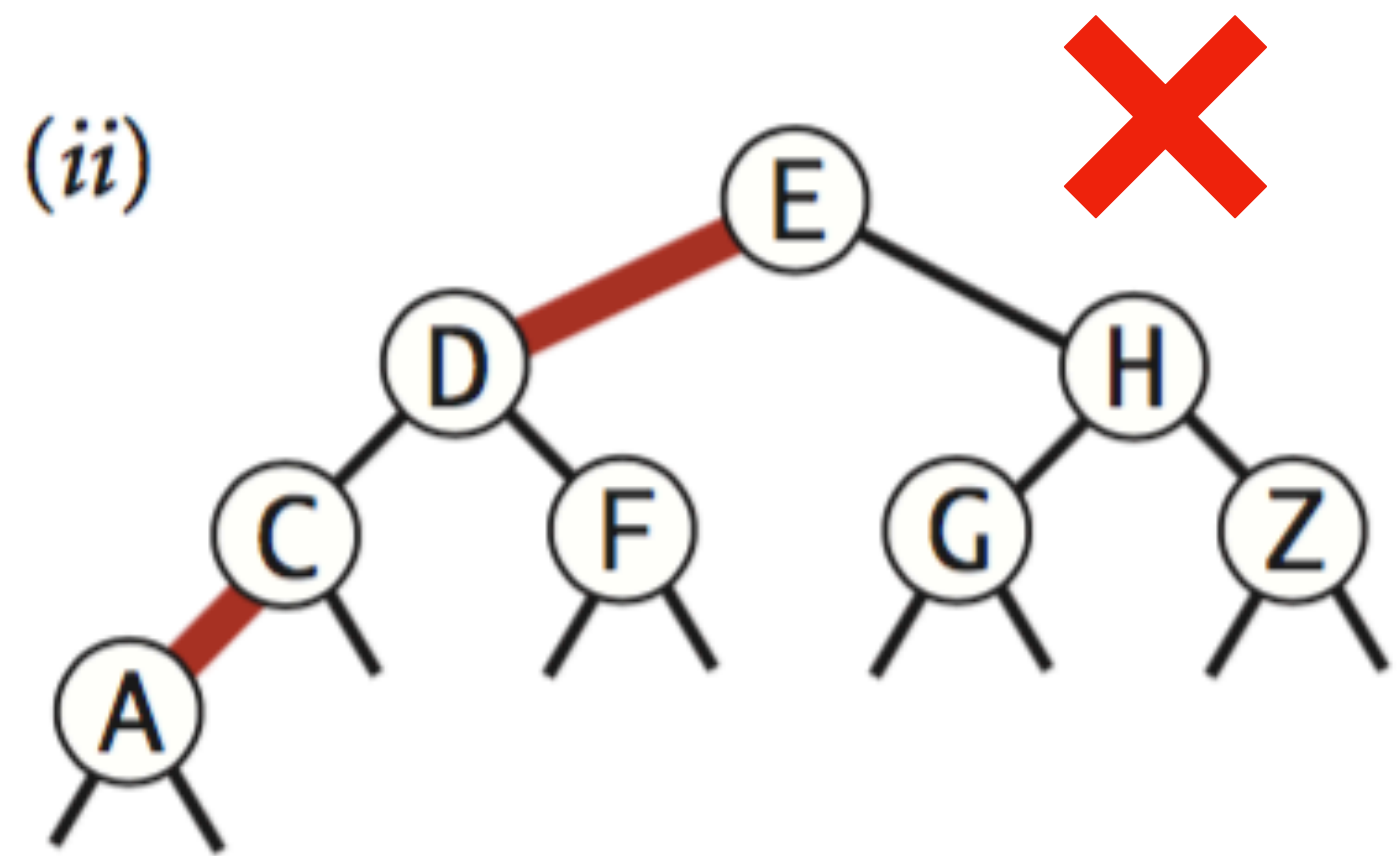
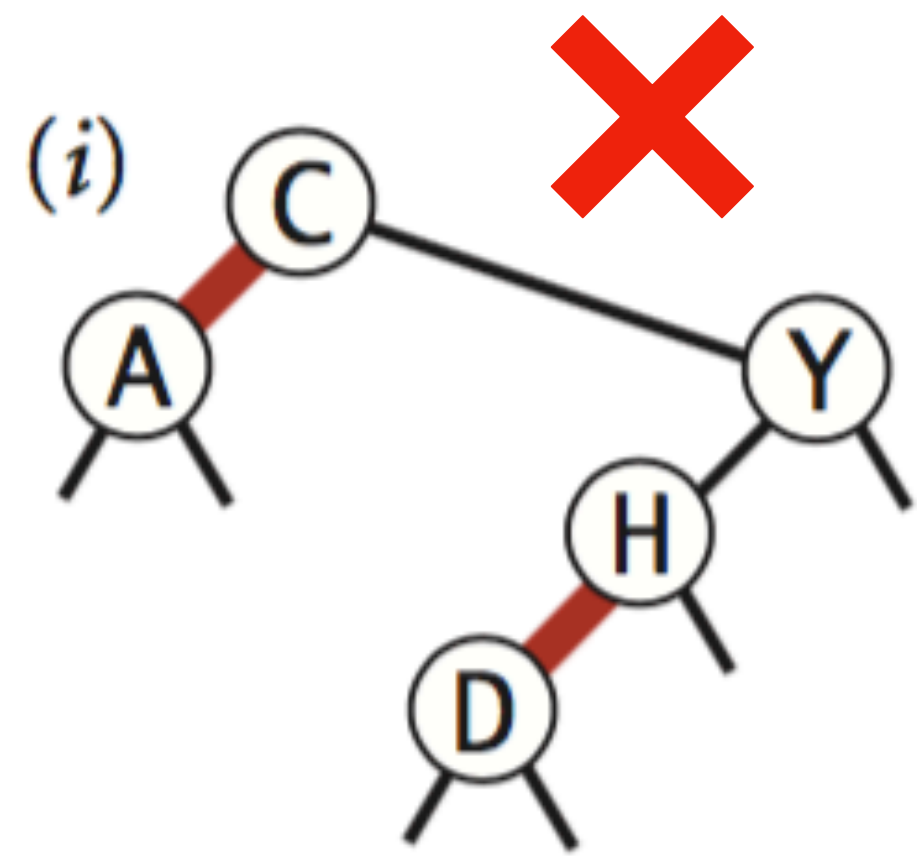
15 est déjà dans l'arbre

~~12, 5, 10, 3, 13, 14, 15, 17, 18, 15~~

Question 3.1.9 insertions



Question 3.1.10 RB?



Question 3.1.7 IS RED BLACK

```
private boolean is23() { return is23(root); }
```

```
private boolean is23(Node x) {
```

```
    if (x == null)
```

```
        return true;
```

```
    //Est-ce que le lien à droite est rouge ?
```

```
    if (isRed(x.right))
```

```
        return false;
```

```
    //Est-ce que le noeud est connecté à deux liens rouges ?
```

```
    if (x != root && isRed(x) && isRed(x.left))
```

```
        return false;
```

```
    return is23(x.left) && is23(x.right);
```

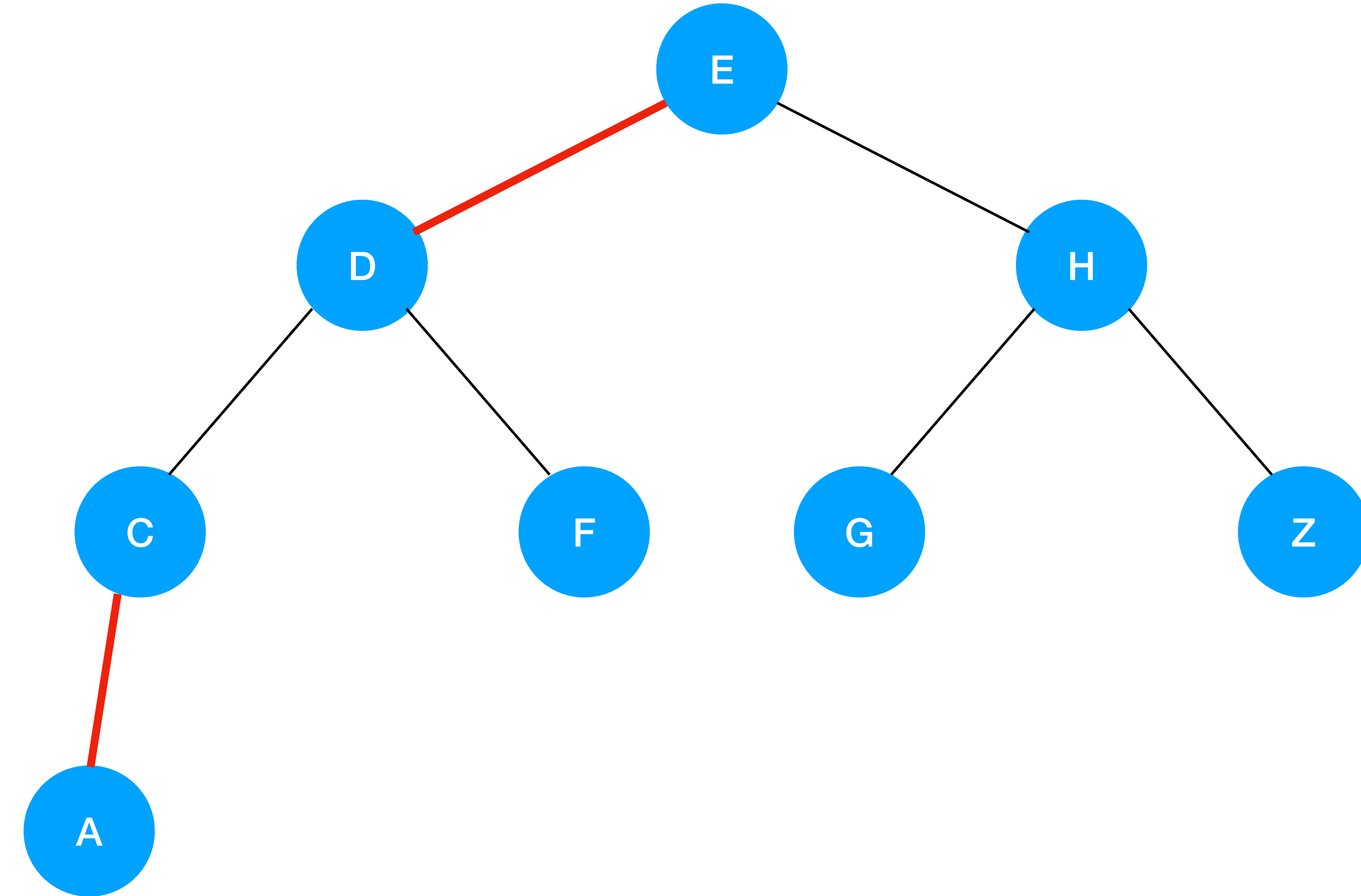
```
}
```

Question 3.1.7 IS RED BLACK

```
private boolean isBalanced() {  
    // nombre de liens noirs de la racine à la clé min  
    int black = 0;  
    Node x = root;  
    while (x != null) {  
        if (!isRed(x)) black++;  
        x = x.left;  
    }  
    // Est-ce qu'on retrouve ce nombre de liens pour chaque feuille ?  
    return isBalanced(root, black);  
}
```

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

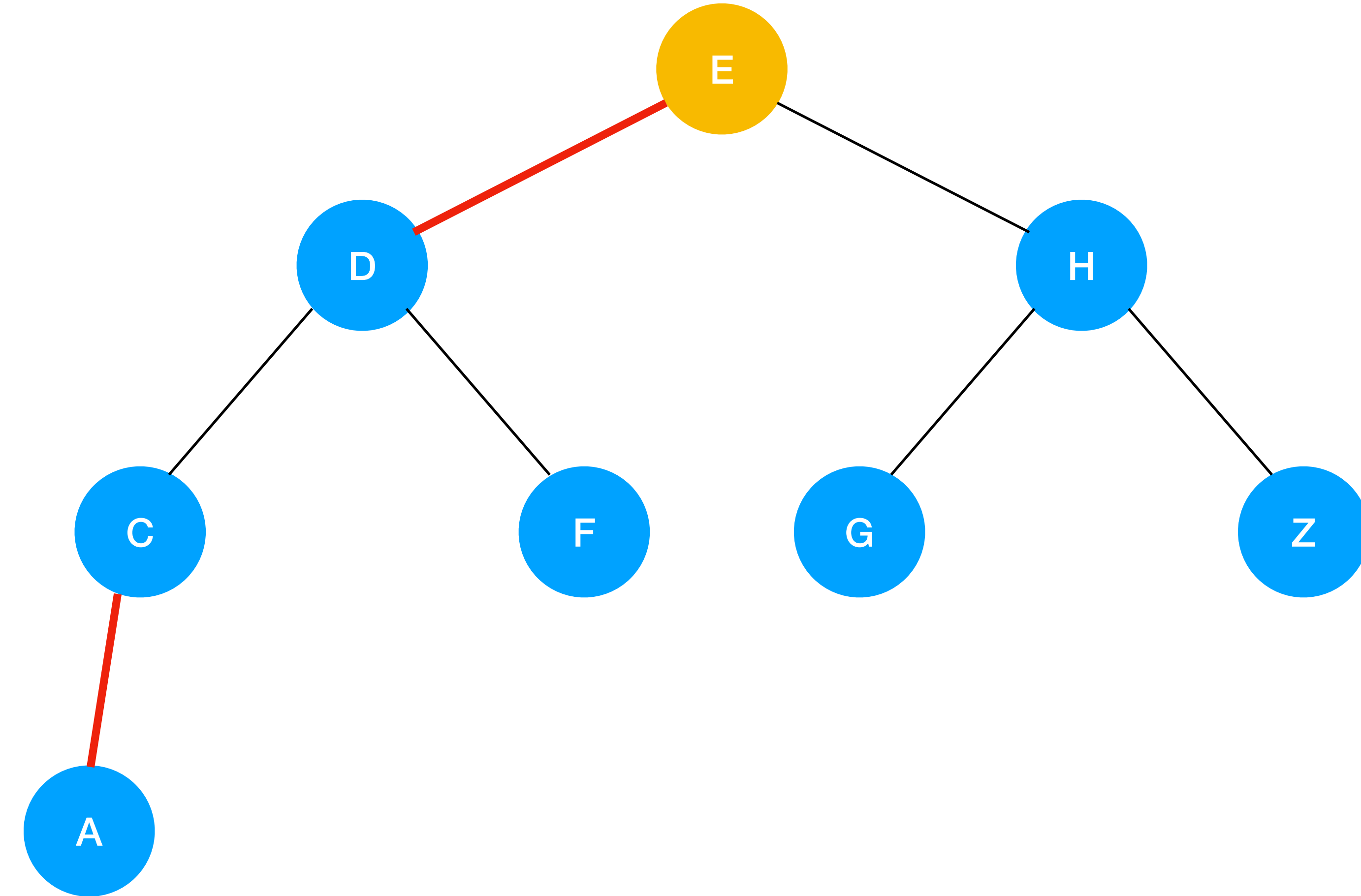
Question 3.1.7 IS RED BLACK



Node =
Black = 0

```
int black = 0;  
Node x = root;
```

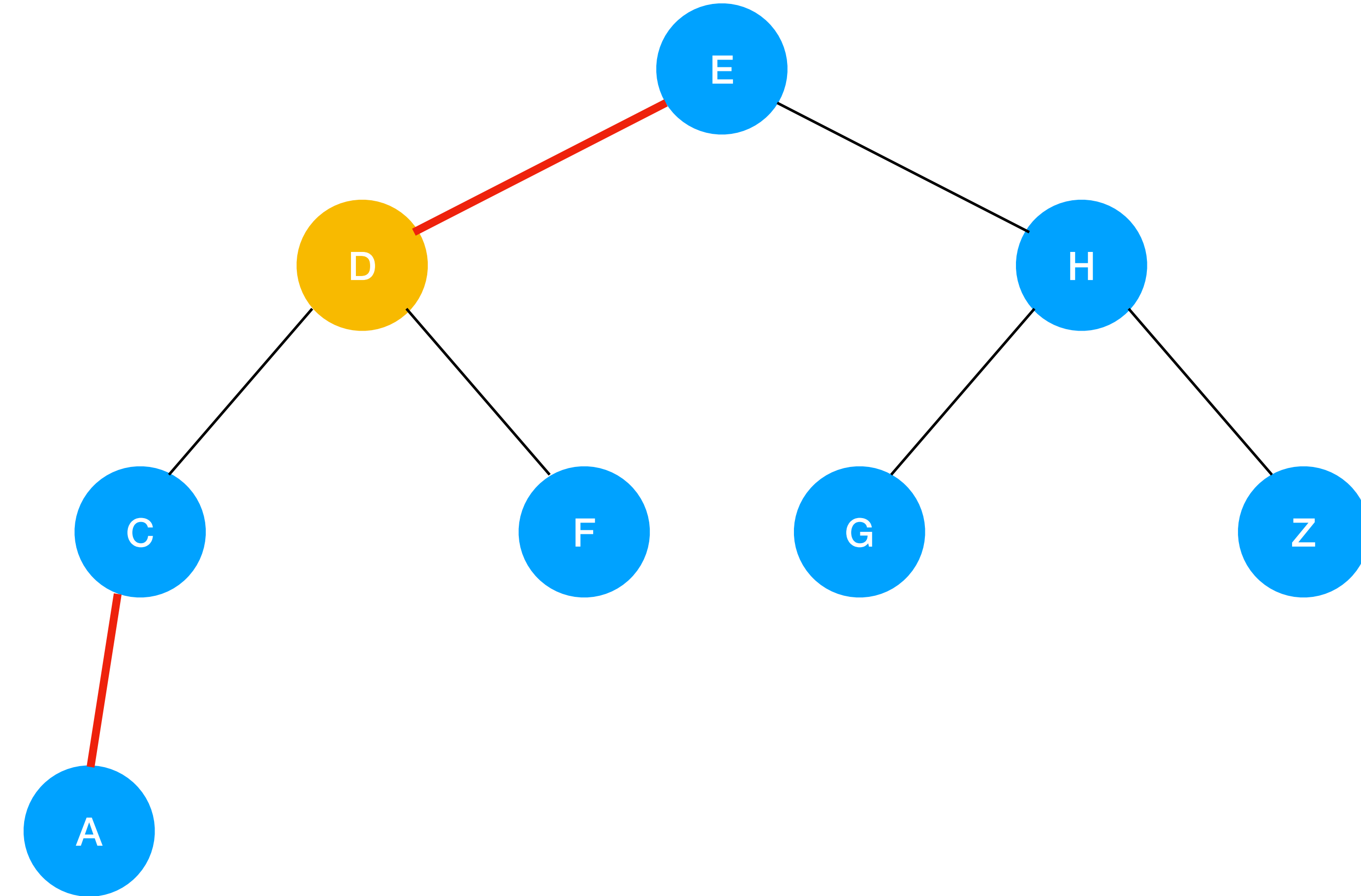
Question 3.1.7 IS RED BLACK



Node = E
Black = 1

```
while (x != null) {  
    if (!isRed(x)) black++;  
    x = x.left;  
}
```

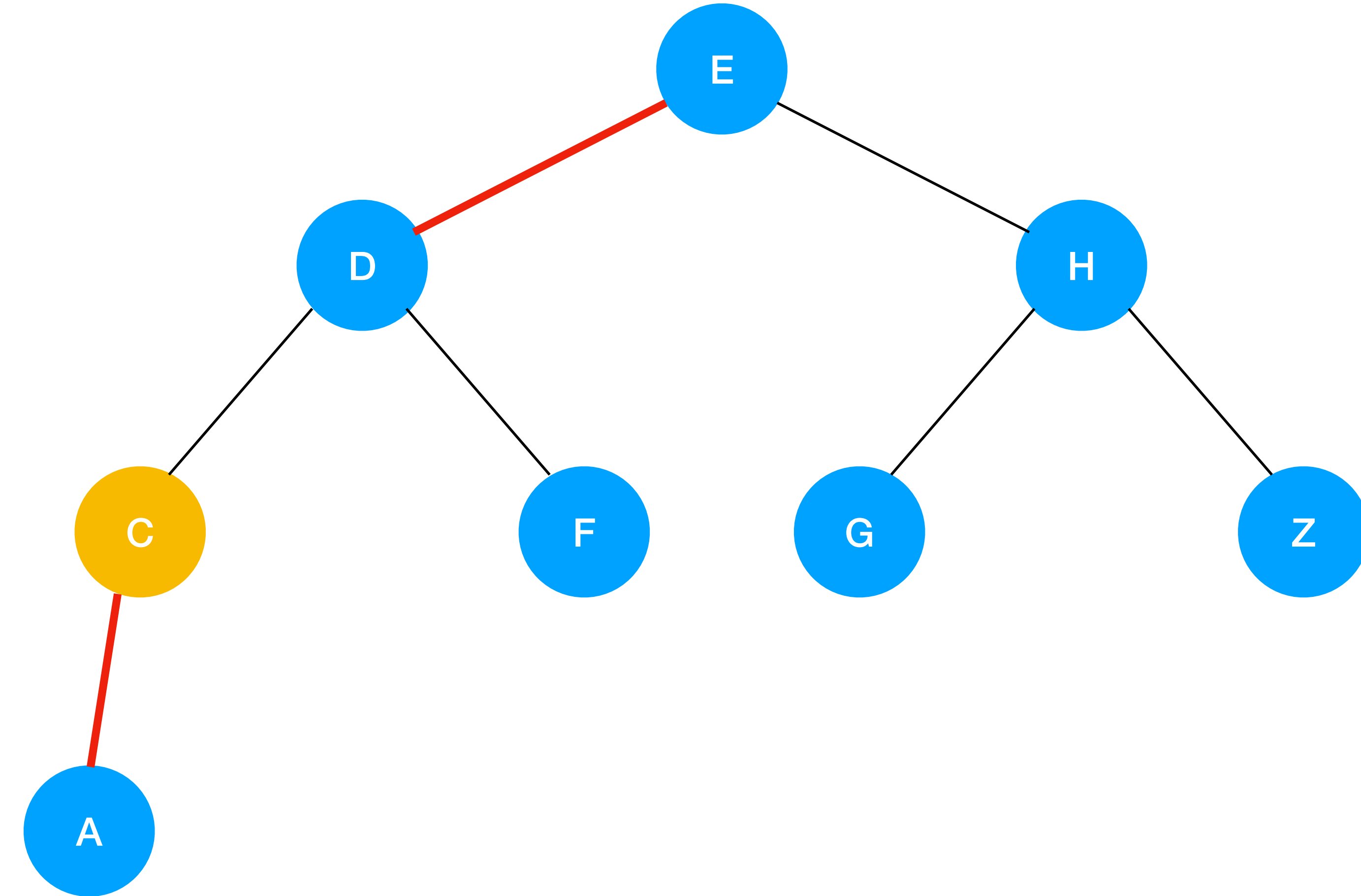
Question 3.1.7 IS RED BLACK



Node = D
Black = 1

```
while (x != null) {  
    if (!isRed(x)) black++;  
    x = x.left;  
}
```

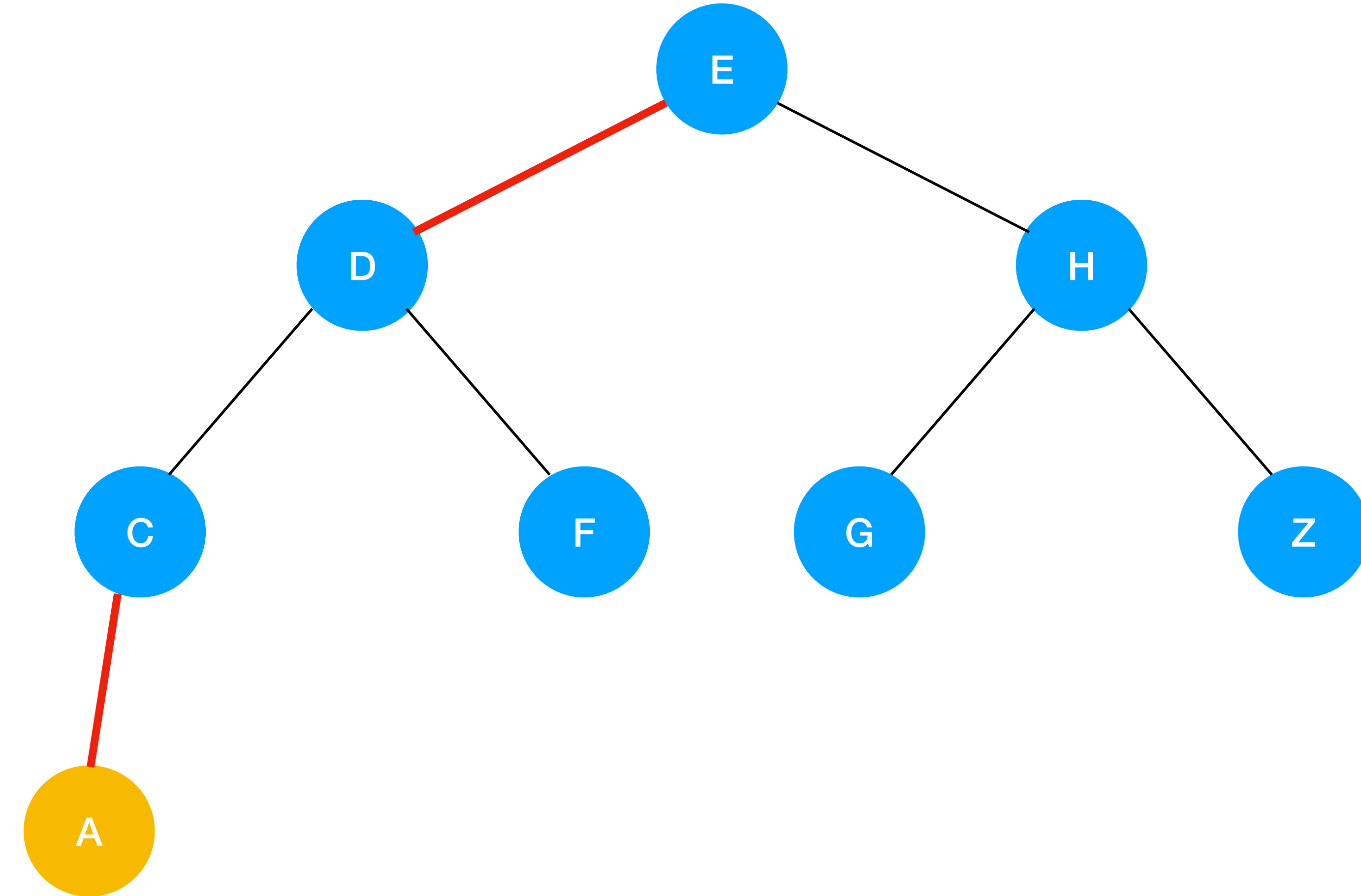
Question 3.1.7 IS RED BLACK



Node = C
Black = 2

```
while (x != null) {  
    if (!isRed(x)) black++;  
    x = x.left;  
}
```

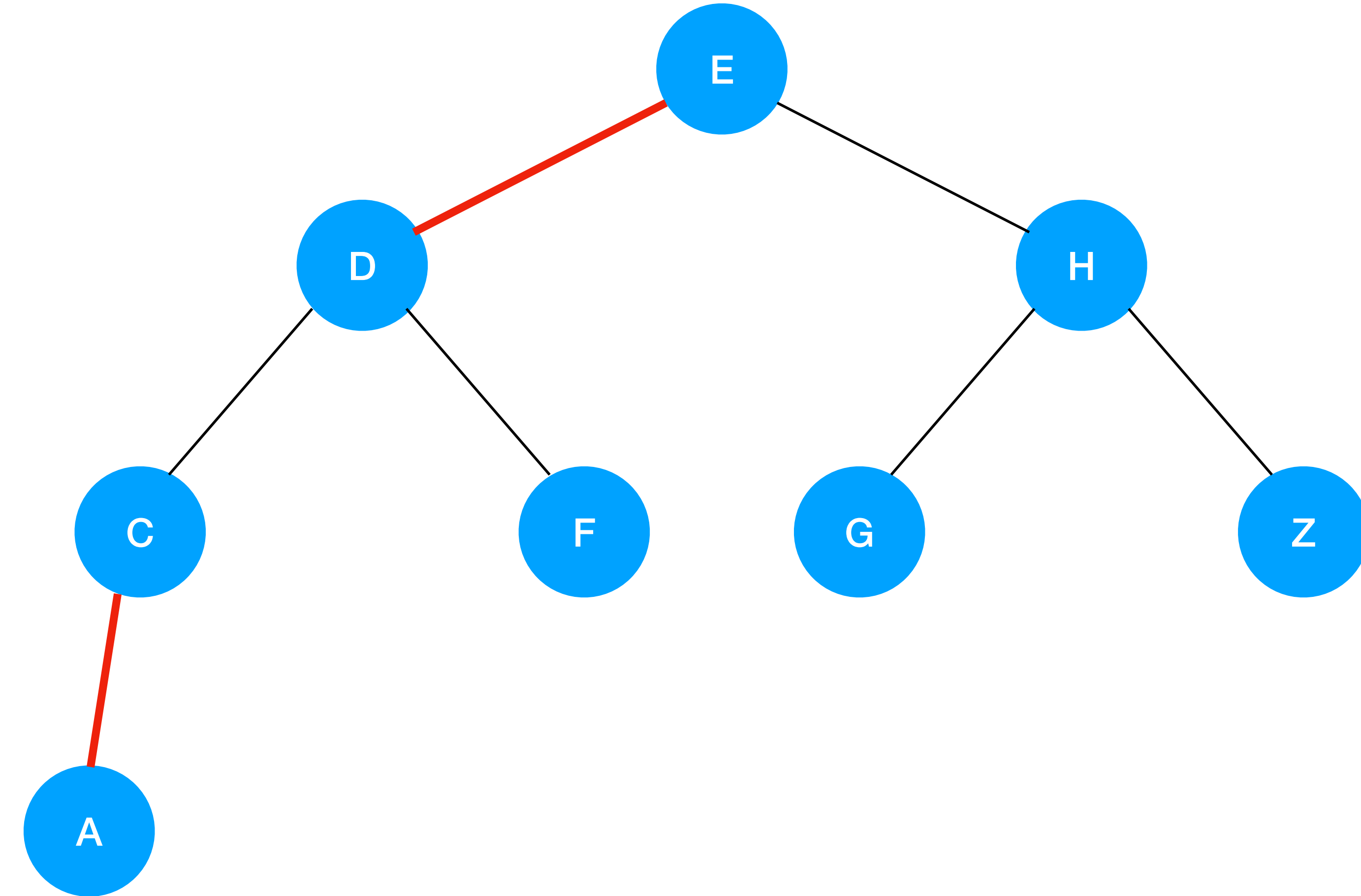
Question 3.1.7 IS RED BLACK



Node = A
Black = 2

```
while (x != null) {  
    if (!isRed(x)) black++;  
    x = x.left;  
}
```

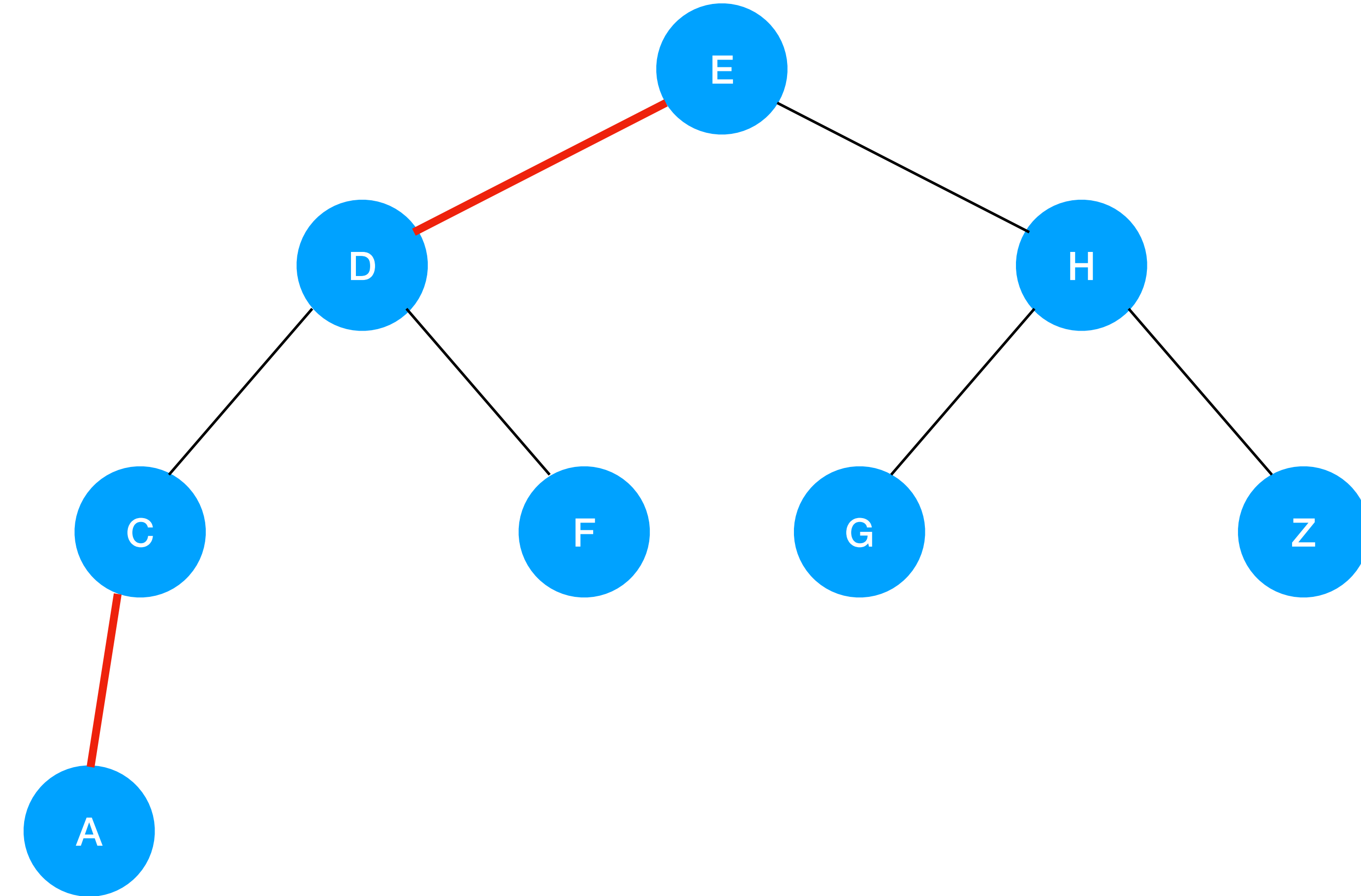

Question 3.1.7 IS RED BLACK



Node = null
Black = 2

```
while (x != null) {  
    if (!isRed(x)) black++;  
    x = x.left;  
}
```

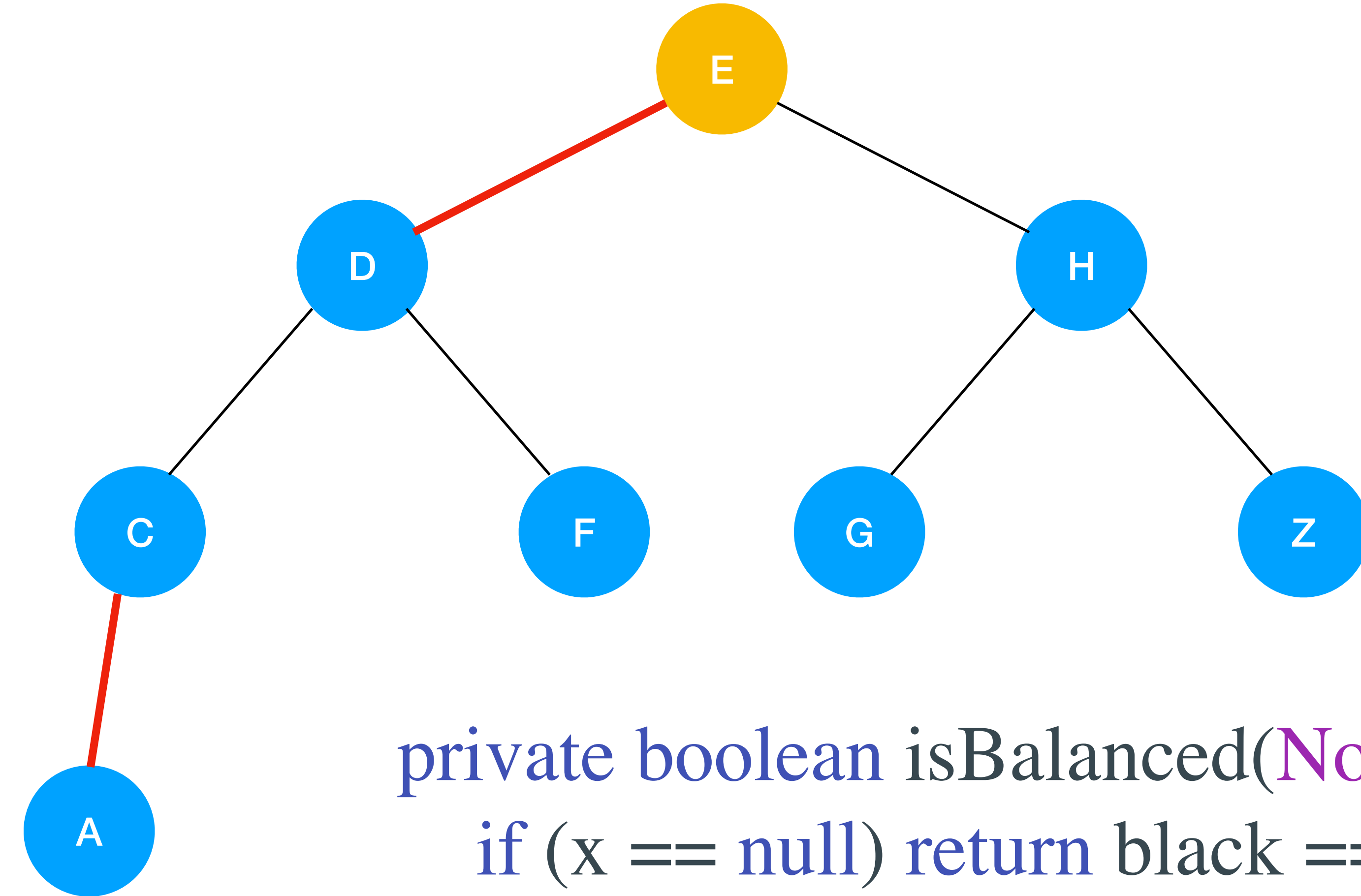
Question 3.1.7 IS RED BLACK



Node =
Black = 2

`return isBalanced(root, black);`

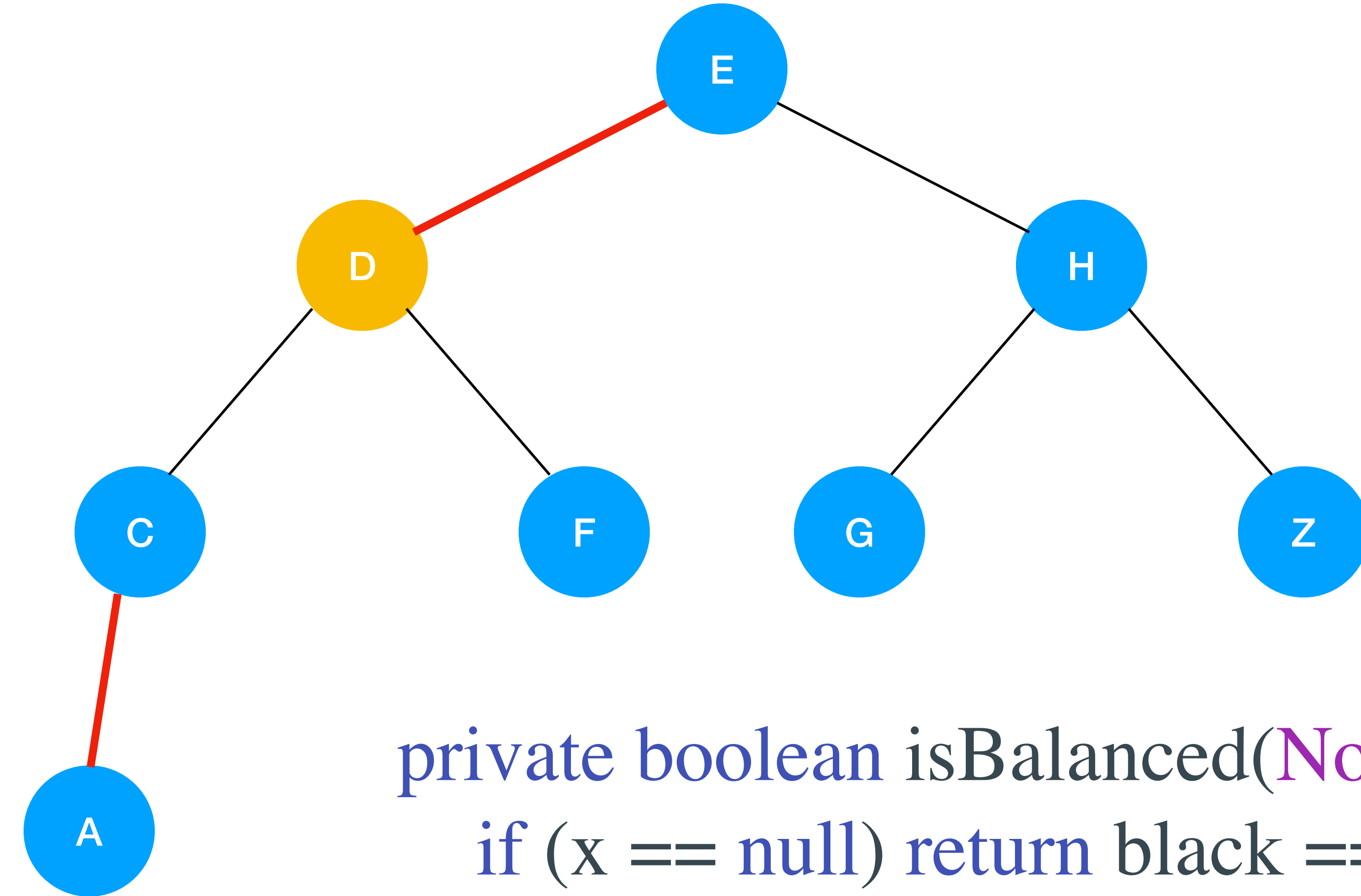
Question 3.1.7 IS RED BLACK



Node = E
Black = 1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

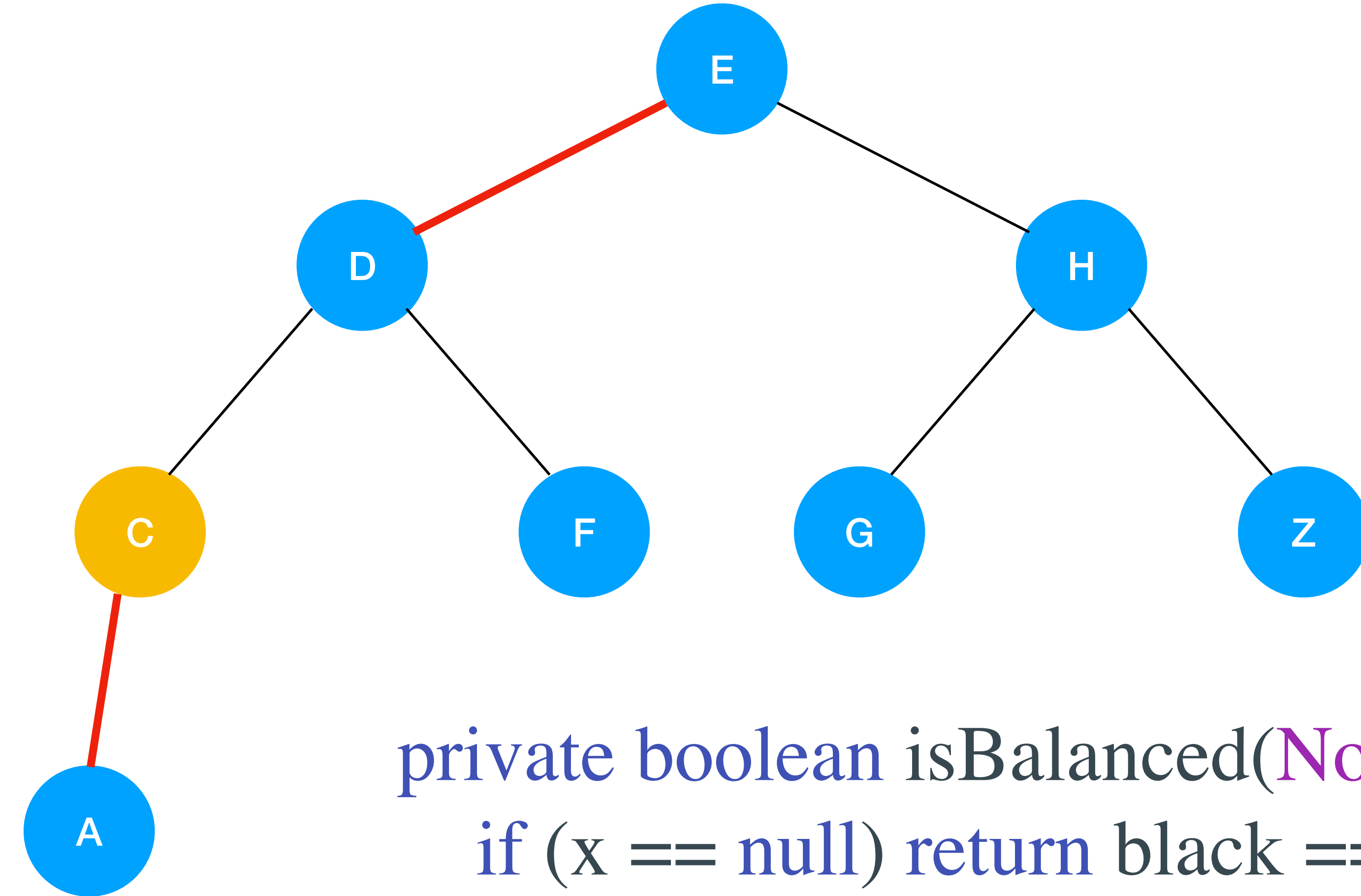
Question 3.1.7 IS RED BLACK



Node = D
Black = 1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

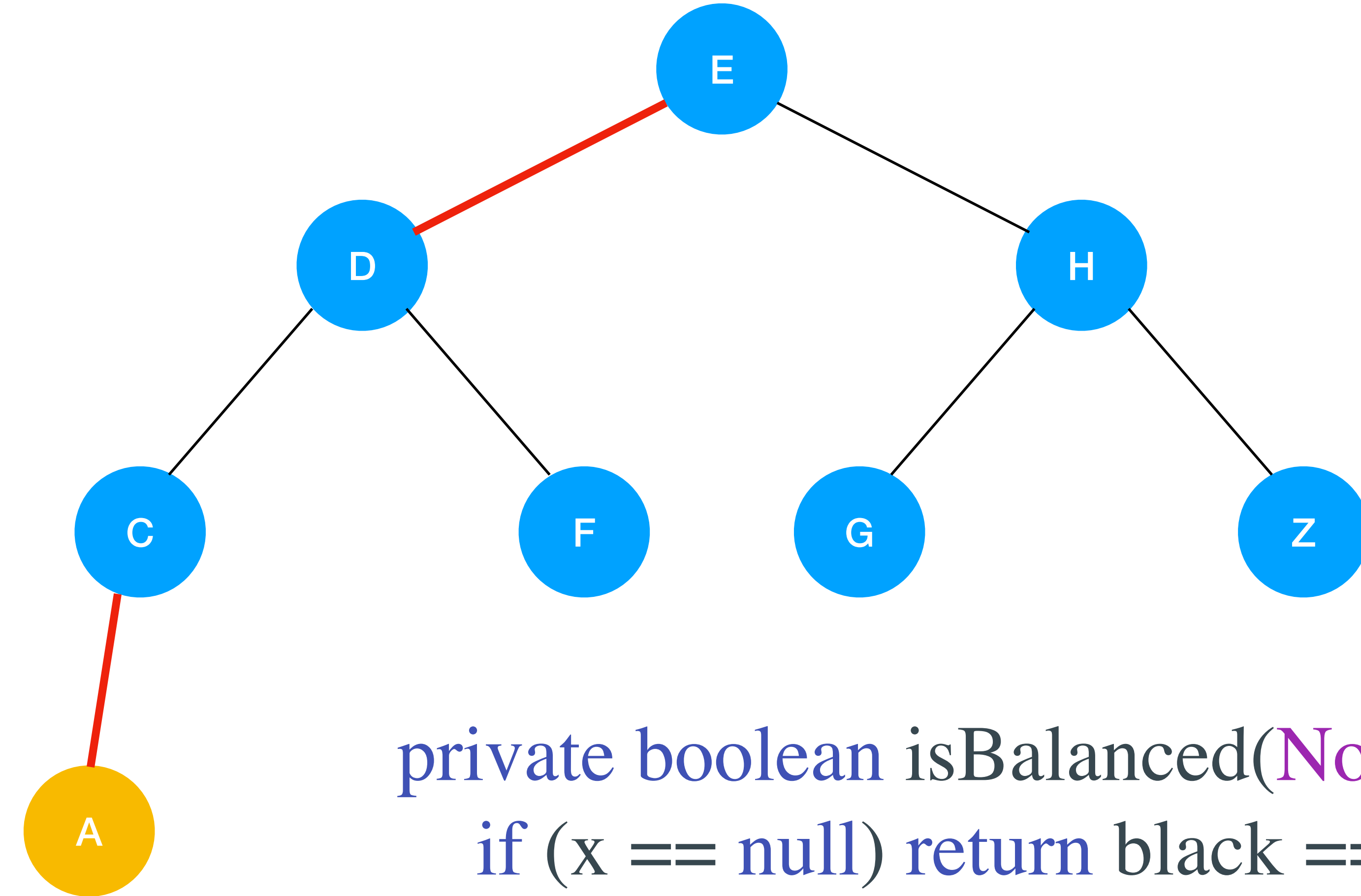
Question 3.1.7 IS RED BLACK



Node = C
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

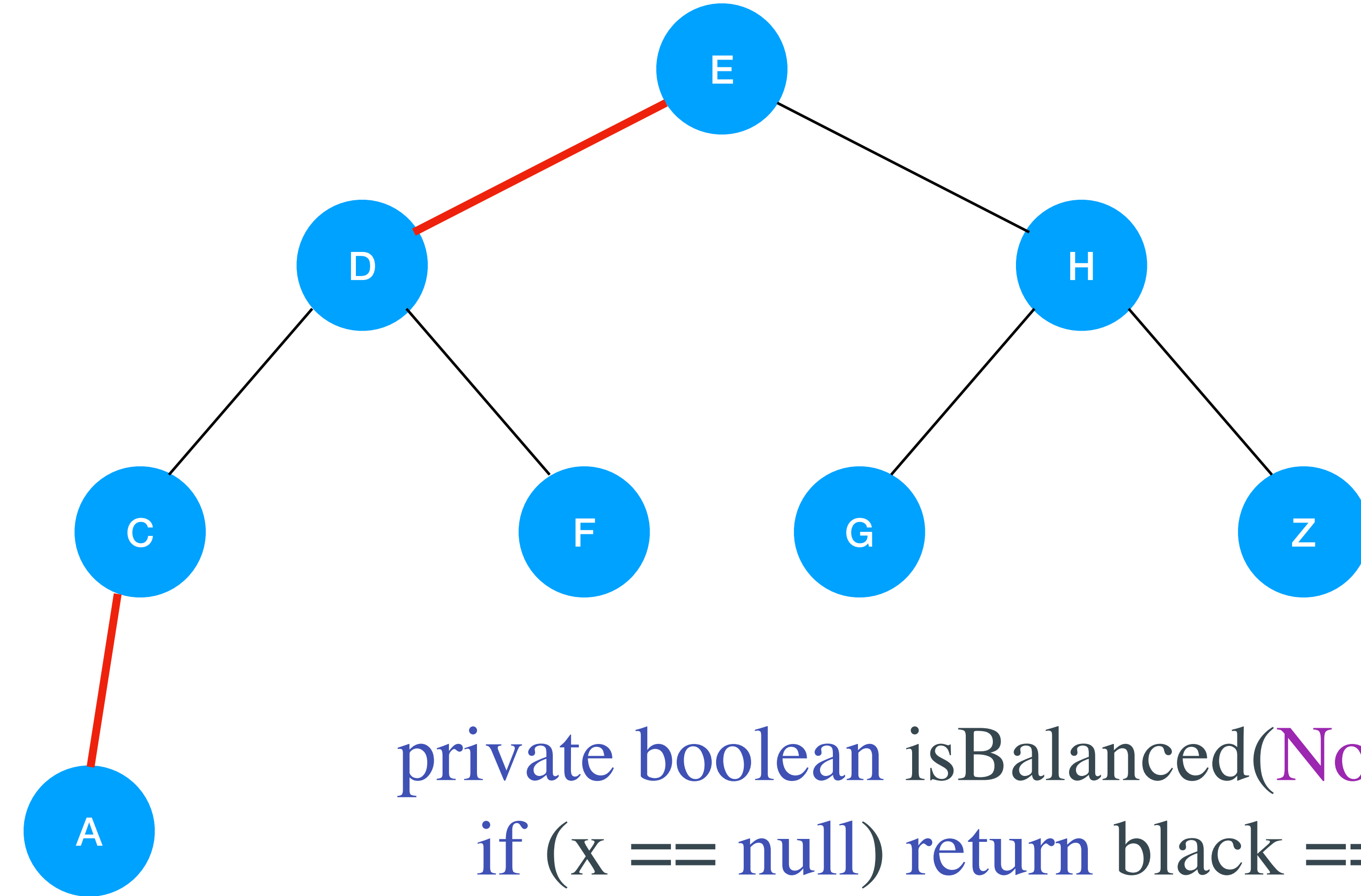
Question 3.1.7 IS RED BLACK



Node = A
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

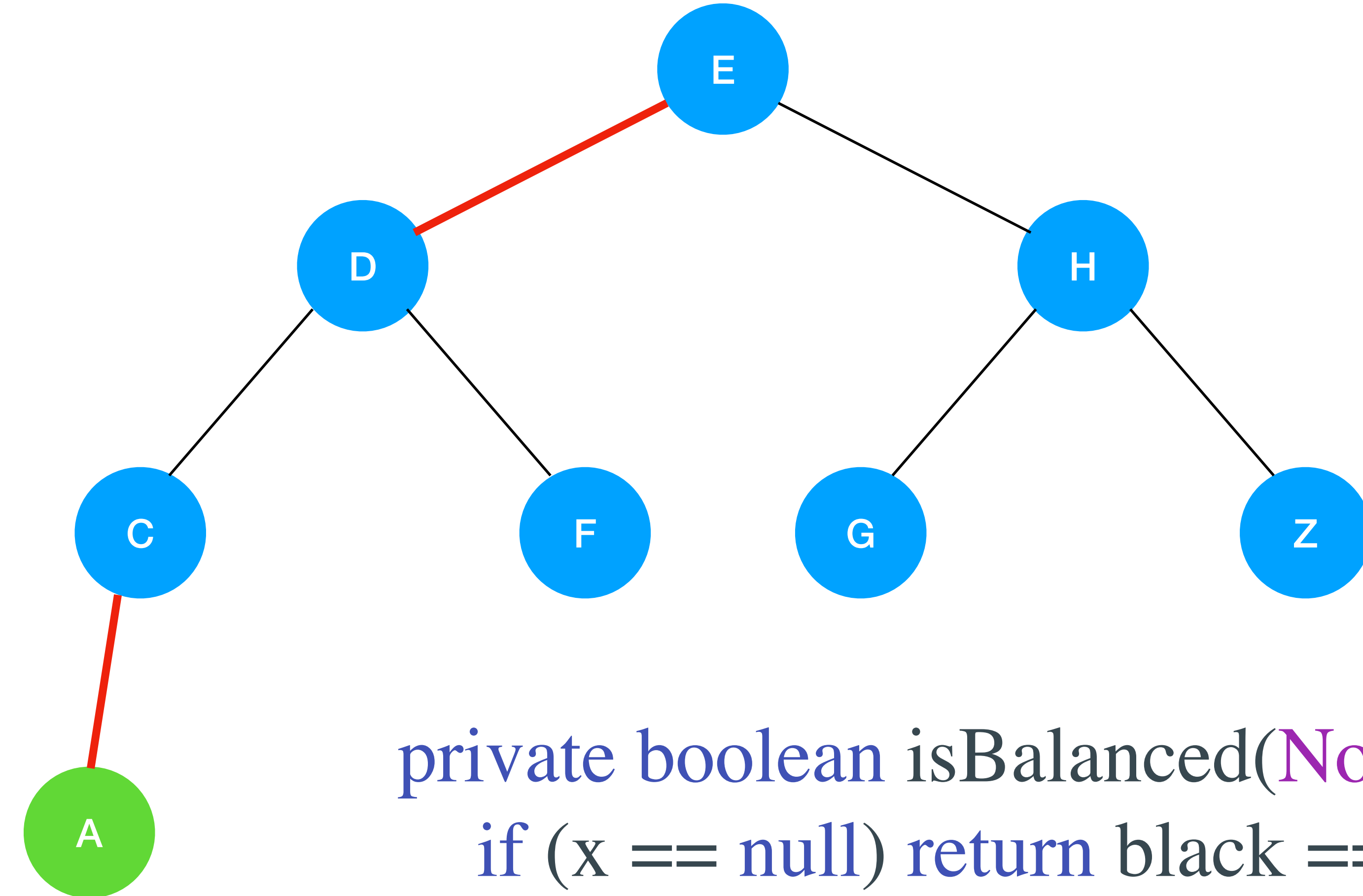
Question 3.1.7 IS RED BLACK



Node = null
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

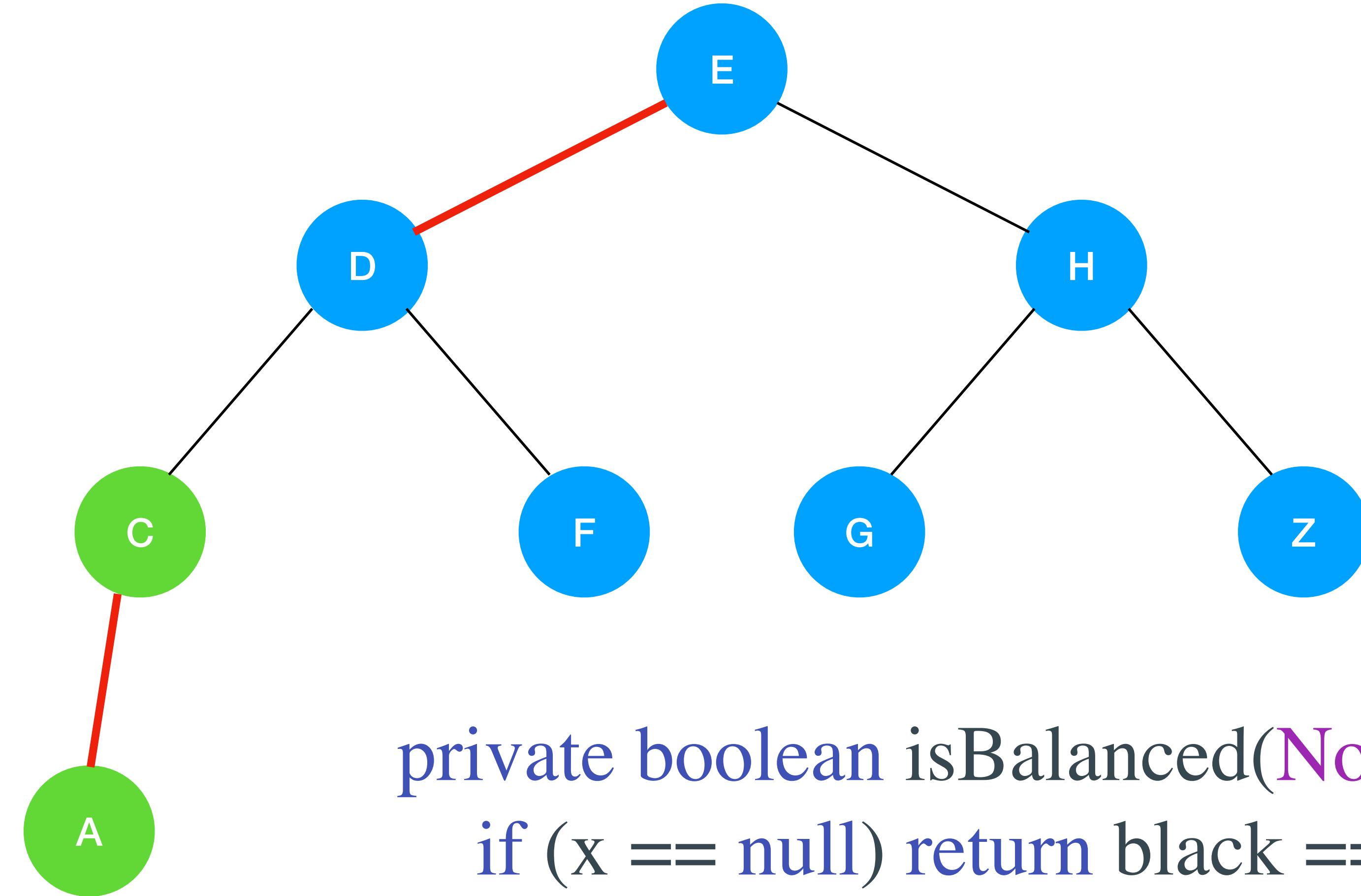
Question 3.1.7 IS RED BLACK



Node = A
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

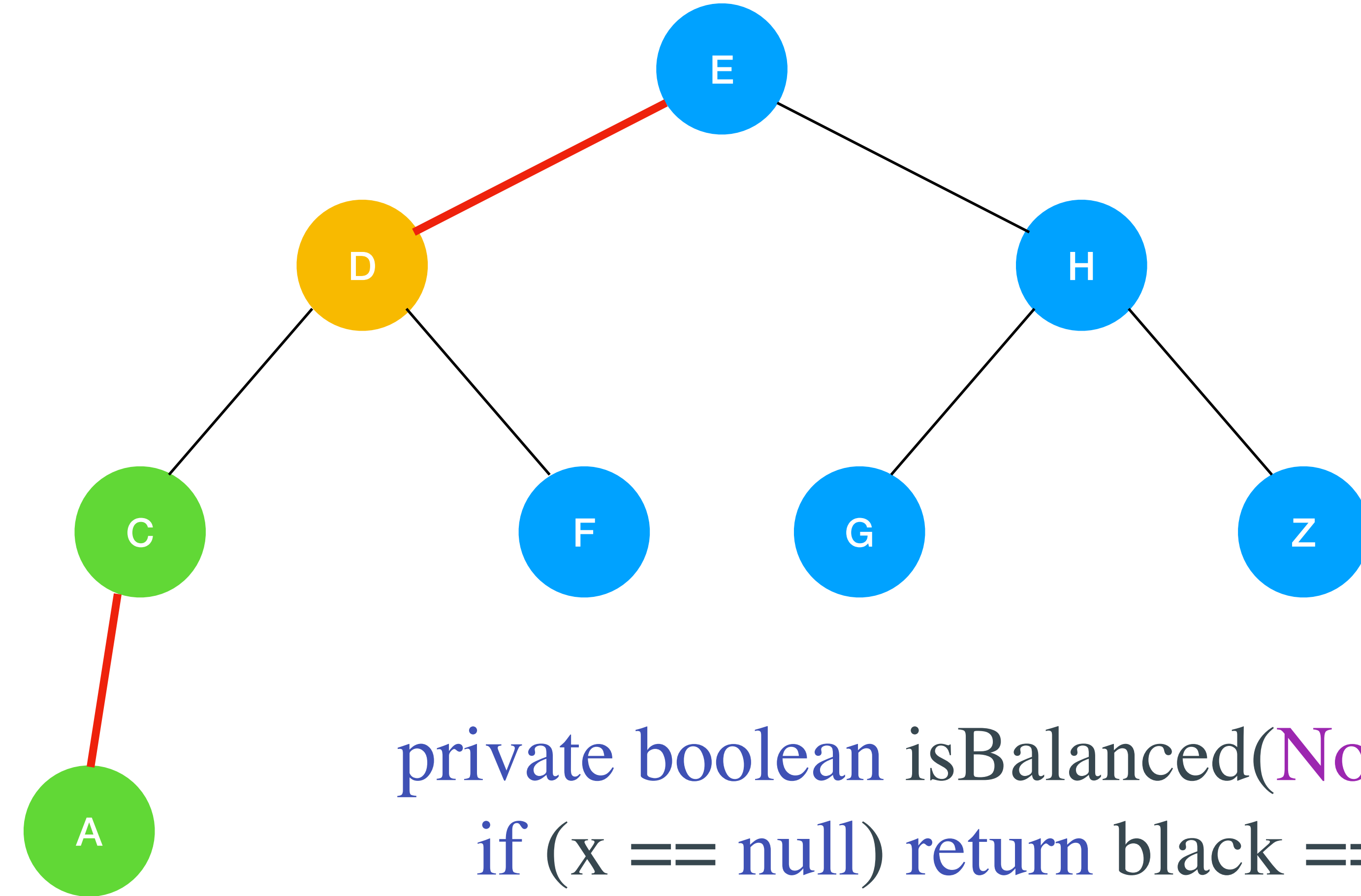

Question 3.1.7 IS RED BLACK



Node = C
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

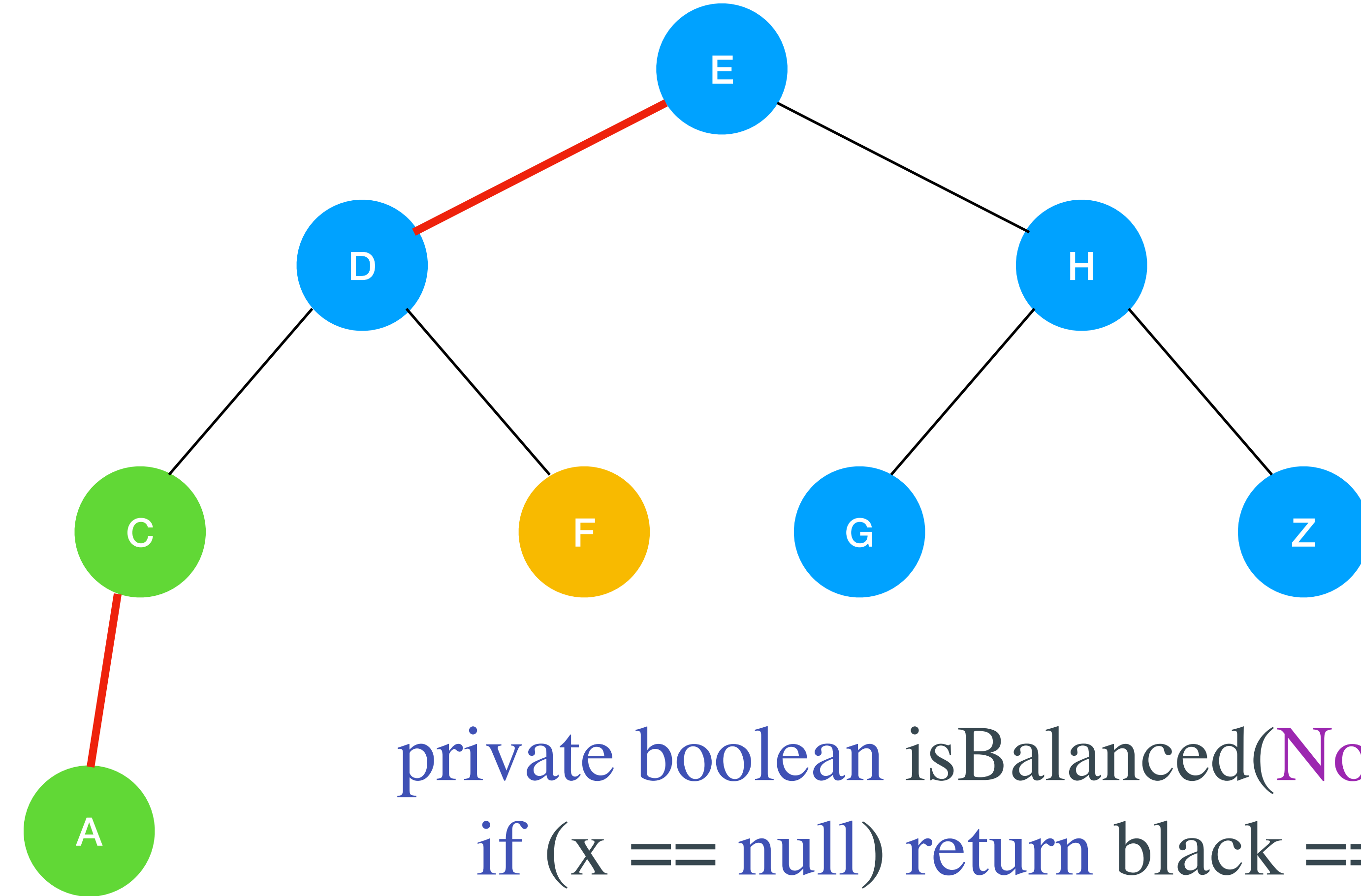
Question 3.1.7 IS RED BLACK



Node = D
Black = 1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

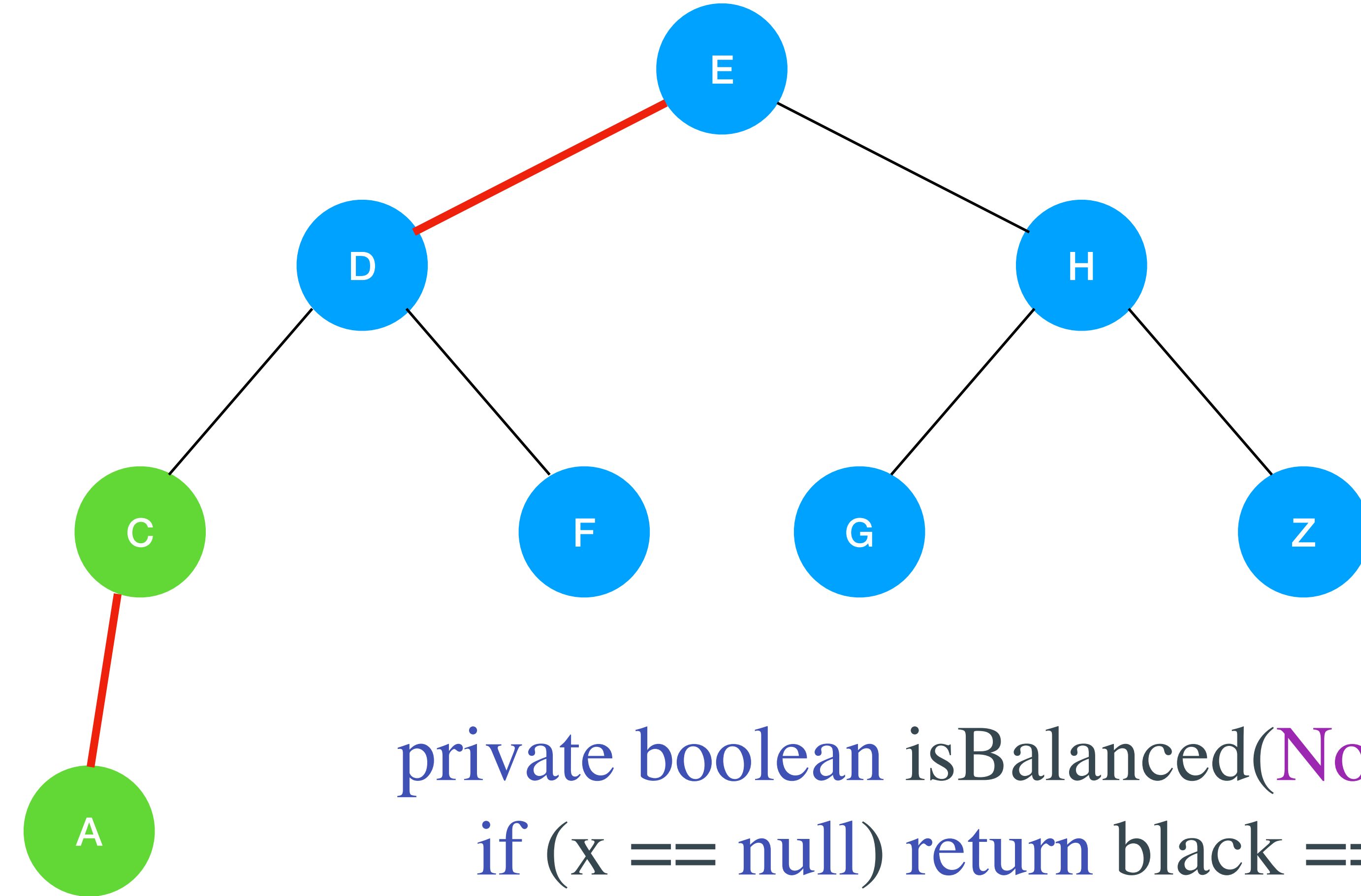
Question 3.1.7 IS RED BLACK



Node = F
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

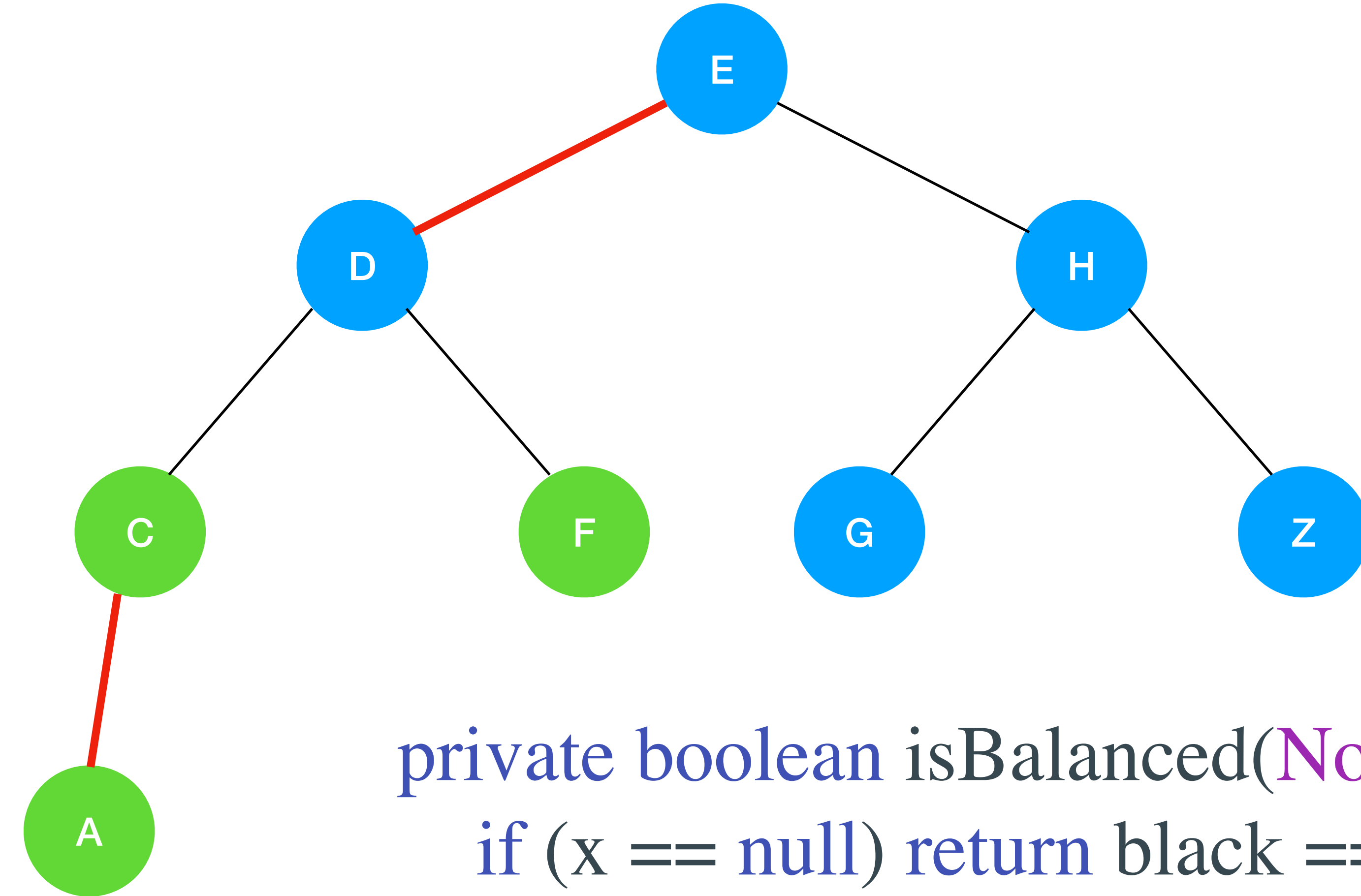
Question 3.1.7 IS RED BLACK



Node = null
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

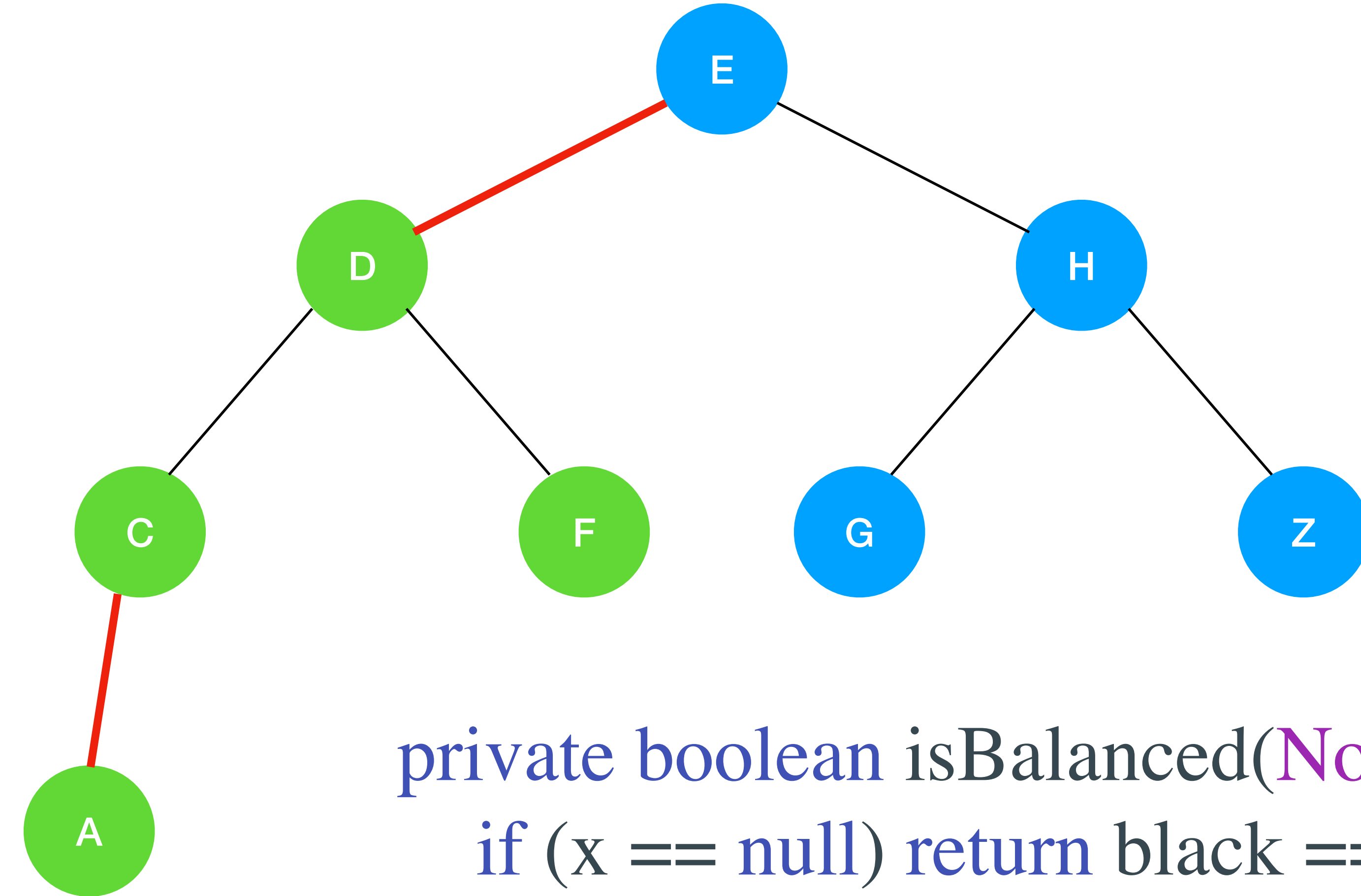
Question 3.1.7 IS RED BLACK



Node = F
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

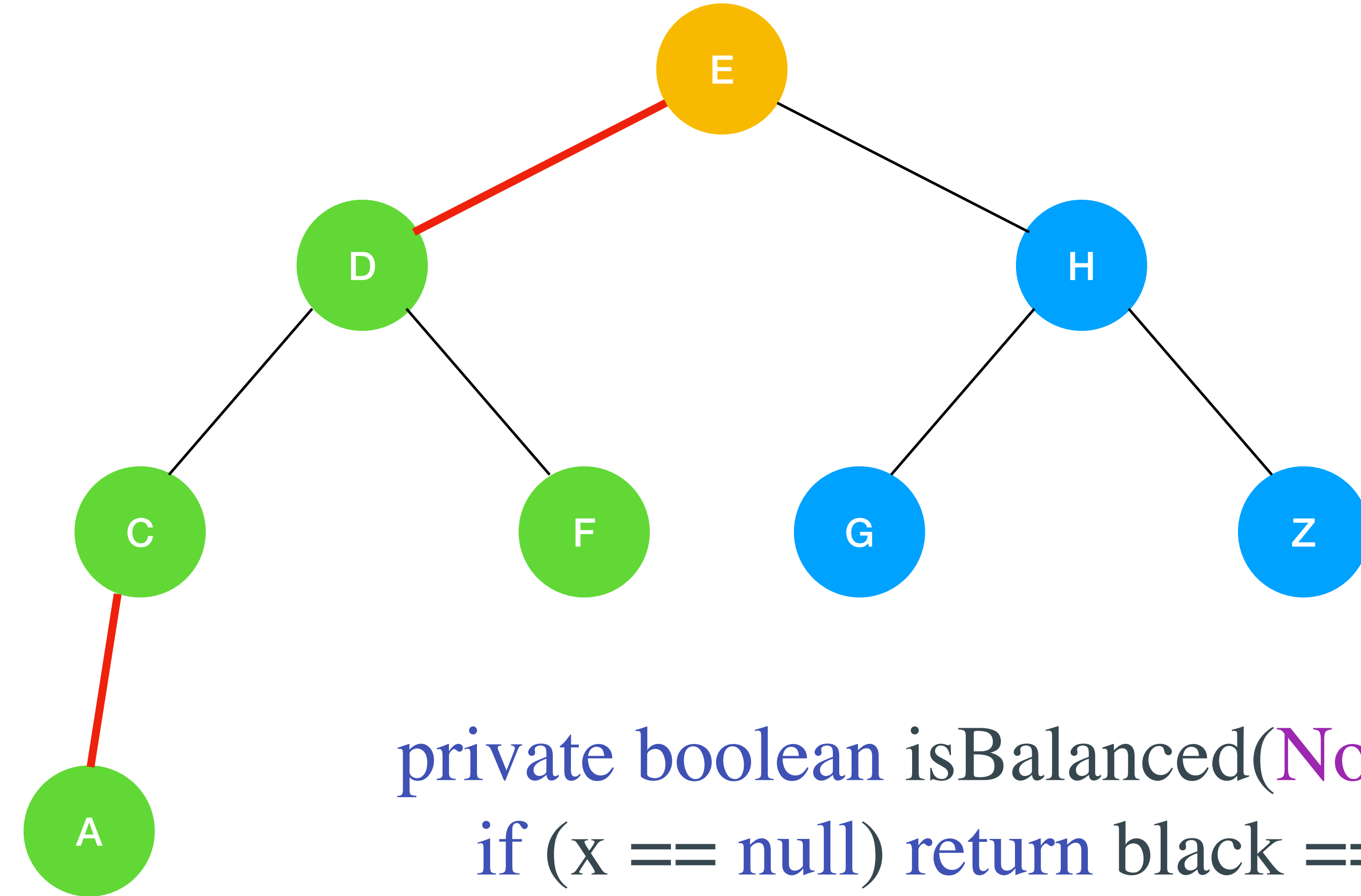
Question 3.1.7 IS RED BLACK



Node = D
Black = 1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

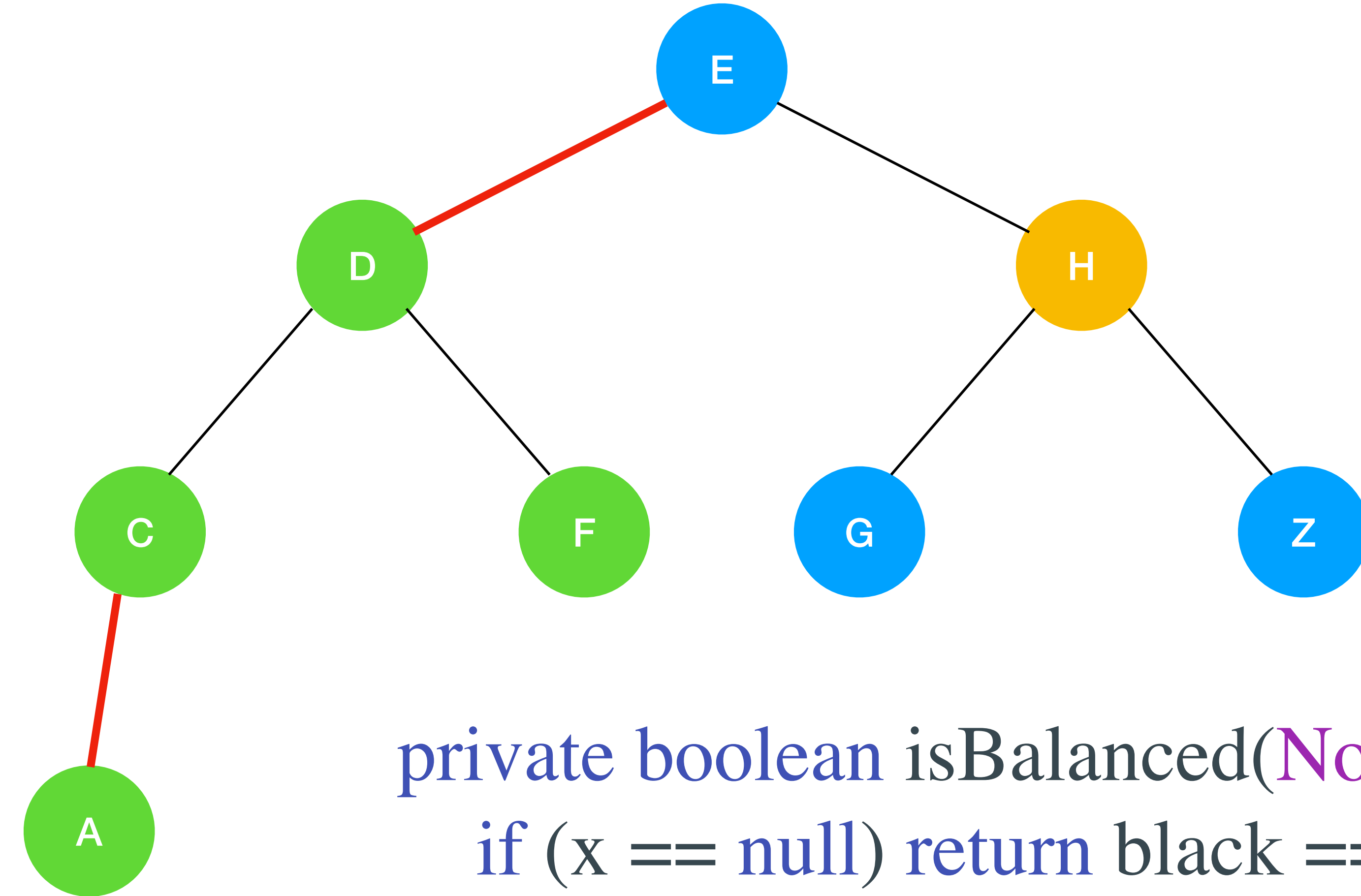
Question 3.1.7 IS RED BLACK



Node = E
Black = 1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

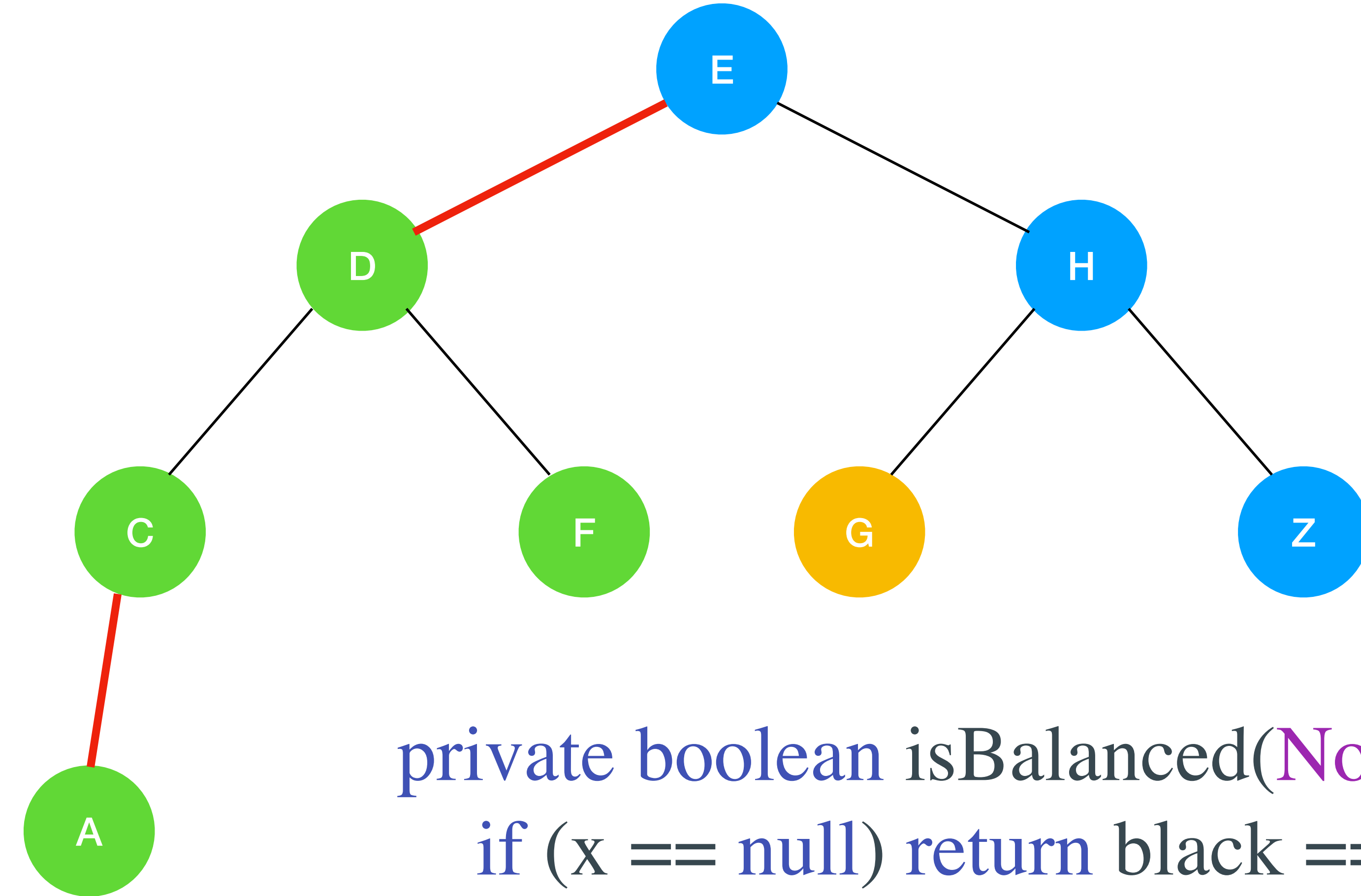
Question 3.1.7 IS RED BLACK



Node = H
Black = 0

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

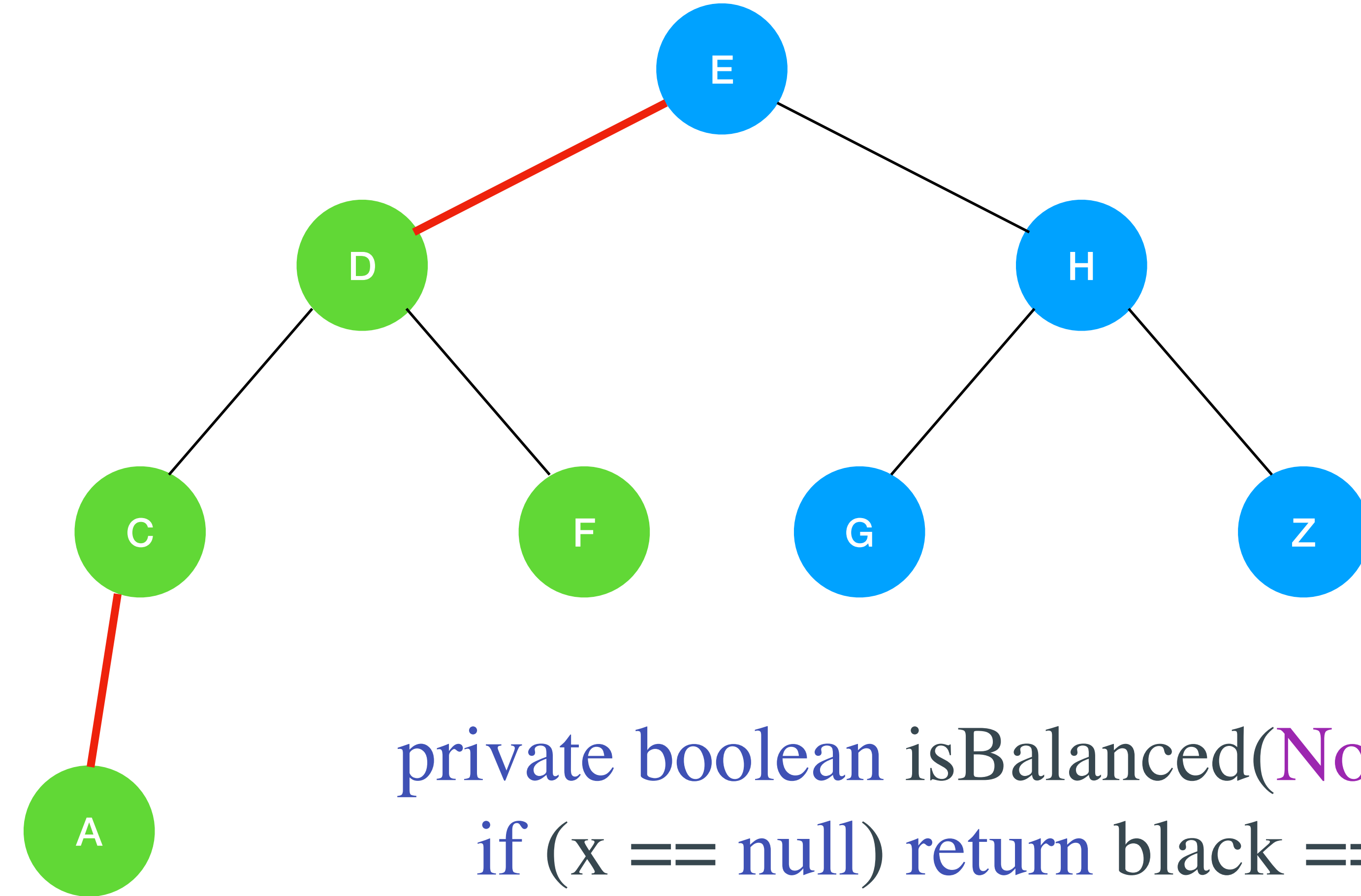

Question 3.1.7 IS RED BLACK



Node = G
Black = -1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

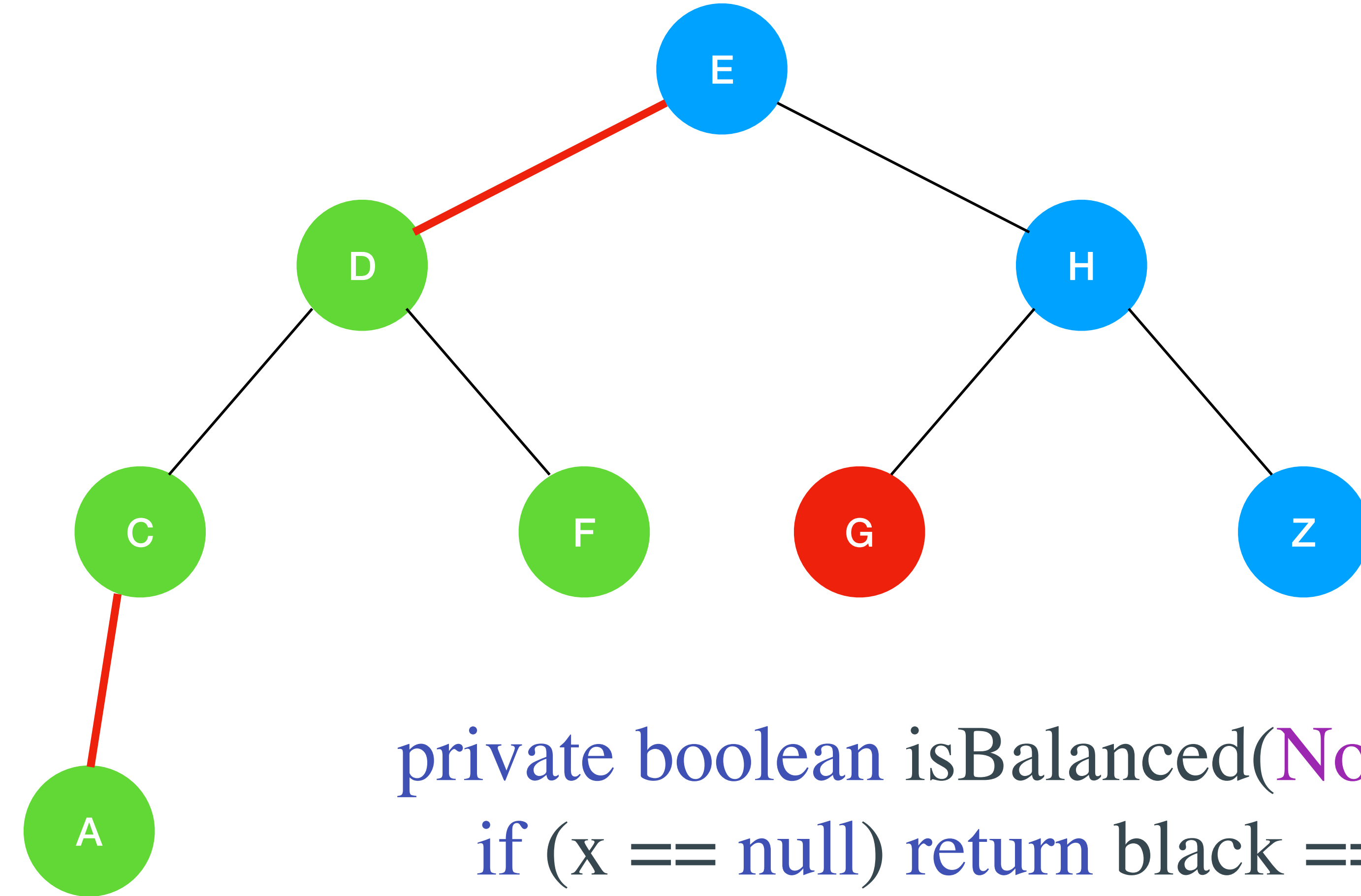
Question 3.1.7 IS RED BLACK



Node = null
Black = -1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

Question 3.1.7 IS RED BLACK



Node = G
Black = -1

```
private boolean isBalanced(Node x, int black) {  
    if (x == null) return black == 0;  
    if (!isRed(x)) black--;  
    return isBalanced(x.left, black) && isBalanced(x.right, black);  
}
```

algorithm (data structure)	worst-case cost (after N inserts)		average-case cost (after N random inserts)		efficiently support ordered operations?
	search	insert	search hit	insert	
<i>sequential search</i> (unordered linked list)	N	N	$N/2$	N	no
<i>binary search</i> (ordered array)	$\lg N$	N	$\lg N$	$N/2$	yes
<i>binary tree search</i> (BST)	N	N	$1.39 \lg N$	$1.39 \lg N$	yes
<i>2-3 tree search</i> (red-black BST)	$2 \lg N$	$2 \lg N$	$1.00 \lg N$	$1.00 \lg N$	yes

Cost summary for symbol-table implementations (updated)