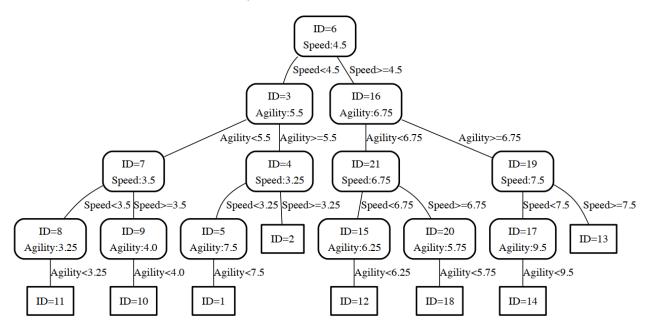
Course example

Table 5.4The extended version of the college athletes dataset.

| ID | SPEED | AGILITY | DRAFT | ID | SPEED | AGILITY | DRAFT |
|----|-------|---------|-------|----|-------|---------|-------|
| 1 | 2.50 | 6.00 | no | 12 | 5.00 | 2.50 | no |
| 2 | 3.75 | 8.00 | no | 13 | 8.25 | 8.50 | no |
| 3 | 2.25 | 5.50 | no | 14 | 5.75 | 8.75 | yes |
| 4 | 3.25 | 8.25 | no | 15 | 4.75 | 6.25 | yes |
| 5 | 2.75 | 7.50 | no | 16 | 5.50 | 6.75 | yes |
| 6 | 4.50 | 5.00 | no | 17 | 5.25 | 9.50 | yes |
| 7 | 3.50 | 5.25 | no | 18 | 7.00 | 4.25 | yes |
| 8 | 3.00 | 3.25 | no | 19 | 7.50 | 8.00 | yes |
| 9 | 4.00 | 4.00 | no | 20 | 7.25 | 5.75 | yes |
| 10 | 4.25 | 3.75 | no | 21 | 6.75 | 3.00 | yes |
| 11 | 2.00 | 2.00 | no | | | | |

Query: SPEED = **6.00**, AGILITY = **3.50**

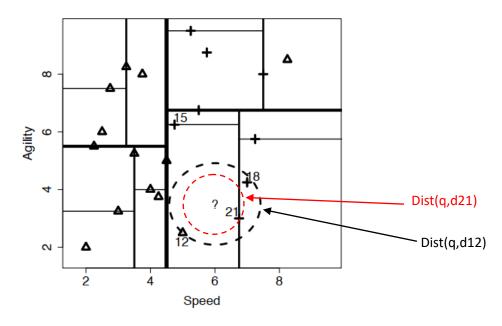


Algorithm 3 Pseudocode description of the k-d tree nearest neighbor retrieval algorithm.

Require: query instance \mathbf{q} and a k-d tree $\mathbf{k}\mathbf{d}\mathbf{t}\mathbf{r}\mathbf{e}\mathbf{e}$

```
1: best = null
2: best-distance = \infty
3: node = descendTree(kdtree,q)
4: while node! = NULL do
       if distance(q,node) < best-distance then
5:
           best = node
6:
           best-distance = distance(q,node)
7:
8:
       end if
       if boundaryDist(q, node) < best-distance then
9:
10:
           node = descendtree(node,q)
       else
11:
12:
           node = parent(node)
13:
       end if
14: end while
15: return best
```

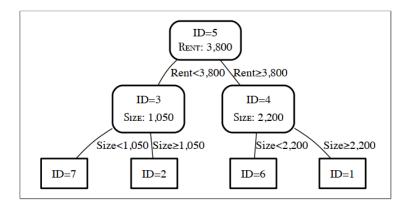
Applying the algorithm for: **Query**: SPEED = **6.00**, AGILITY = **3.50**



- Start algo: Best dist. = infinity, node = descent Tree (KdTree, q) → search leads to leaf node d12
- Dist. (q, d12) = 1.4142 (Best dist. updated) → line 9 leaf node has no boundary dist. so we execute the "else" line 11 and we go to its parent which is node d15.
- Dist. (q, d15) = 3.0208 (Line 5 fails no update for best dist.) || Boundary_Dist (q, d15/AGILITY) =2.75 → bigger than best don't descend subtree (Line 9 fails thus we go to its parent node with d21)
- Dist. (q, d21) = 0.9014 (Best dist. updated) || Boundary_Dist (q, d21/SPEED) = 0.75 → smaller than best, thus descend subtree (Line 9 succeed we traverse the subtree → the right subtree of d21 which leads to the leaf node d18)
- Dist. (q, d18) = 1.2500 (Line 5 fails no update for best dist.) || line 9 leaf node no boundary so we do the else line 11 and we go to its parent which is d20
- Dist. (q, d20) = 2.75 (Line 5 fails no update for best dist.) || Boundary_Dist (q, d20/ AGILITY) = 2.25 → bigger than best don't descend subtree (Line 9 fails thus we go to its parent which is d16)
- Dist. (q, d16) = 3.2882 (Line 5 fails no update for best dist.) || Boundary_Dist (q, d16/ AGILITY) = 3.25 → bigger than best don't descend subtree (Line 9 fails thus we go to its parent which is the root node d6)
- Dist. (q, d6) = 2.1213 (Line 5 fails no update for best dist.) || Boundary_Dist (q, d6/SPEED) =1.5 → bigger than best don't descend subtree (Line 9 fails thus we go to its parent) → no parent node (parent node == NULL) for the root, thus exits the while loop and return the best which is **d21**

Tutorial example

| ID | SIZE | RENT | PRICE |
|----|-------|-------|-----------|
| 1 | 2,700 | 9,235 | 2,000,000 |
| 2 | 1,315 | 1,800 | 820,000 |
| 3 | 1,050 | 1,250 | 800,000 |
| 4 | 2,200 | 7,000 | 1,750,000 |
| 5 | 1,800 | 3,800 | 1,450,500 |
| 6 | 1,900 | 4,000 | 1,500,500 |
| 7 | 960 | 800 | 720,000 |



Query: Size = 1000, Rent = 2200.

- Start algo: Best dist. = infinity, node = descent Tree (KdTree, q) → search leads to leaf node d7
- Dist. (q, d7) = 1400.57 (Best dist. updated) → line 9 leaf node has no boundary dist. so we execute the "else" line 11 and we go to its parent which is node d3.
- Dist. (q, d3) = 951.31 (Best dist. updated) || Boundary_Dist (q, d3/RENT) = 50 → smaller than best, thus descend subtree (Line 9 succeed we traverse the subtree → the right subtree of d3 which leads to the leaf node d2)
- Dist. (q, d2) = 509.14 (Best dist. updated) → line 9 leaf node has no boundary dist. so we execute the "else" line 11 and we go to its parent which is node d5 (the root node).
- Dist. (q, d5) = 1788.85 (Line 5 fails no update for best dist.) || Boundary_Dist (q, d5/ RENT) =1600 bigger than best don't descend subtree (Line 9 fails thus we go to its parent) → no parent node (parent node == NULL) for the root, thus exits the while loop and return the best which is d2.