

summing the arc costs encountered while tracing the pointers from  $n$  to  $s$ . (This path is the lowest cost path from  $s$  to  $n$  found so far by the search algorithm. The value of  $g(n)$  for certain nodes may decrease if the search tree is altered in step 7.) Notice that this definition implies  $g(n) \geq g^*(n)$ . For the estimate  $h(n)$ , of  $h^*(n)$ , we rely on heuristic information from the problem domain. Such information might be similar to that used in the function  $W(n)$  in the 8-puzzle example. We call  $h$  the *heuristic function* and will discuss it in more detail later.

Suppose we now use as an evaluation function

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

We call the **GRAPHSEARCH** algorithm using this evaluation function for ordering nodes, *algorithm A*. Note that when  $h \equiv 0$  and  $g \equiv d$  (the depth of a node in the search tree), algorithm *A* is identical to breadth-first search. We claimed earlier that the breadth-first algorithm is guaranteed to find a minimal length path to a goal. We now show that if  $h$  is a lower bound on  $h^*$  (that is, if  $h(n) \leq h^*(n)$  for all nodes  $n$ ), then algorithm *A* will find an optimal path to a goal. When algorithm *A* uses an  $h$  function that is a lower bound on  $h^*$ , we call it *algorithm A\** (read "A-star"). Since  $h \equiv 0$  is certainly a lower bound on  $h^*$ , the fact that the breadth-first algorithm finds minimal length paths follows directly as a special case of this more general result for algorithm *A\**.

### 2.4.3. THE ADMISSIBILITY OF A\*.

Let us say that a search algorithm is *admissible* if, for any graph, it always terminates in an optimal path from  $s$  to a goal node whenever a path from  $s$  to a goal node exists. In this section we show informally that *A\** is admissible.

To show that an algorithm is admissible, it is necessary to show, at least, that it terminates whenever a goal node is accessible. The **GRAPHSEARCH** algorithm terminates (if at all) either in step 3 or in step 5. Notice that in every cycle through the loop of the algorithm, a node is removed from *OPEN* and that only a finite number of new successors are added to *OPEN*. For finite graphs, we ultimately run out of new successors, and thus, unless the algorithm terminates successfully in step 5 by finding a goal node, it will terminate in step 3 after eventually depleting *OPEN*. Therefore,

**RESULT 1: GRAPHSEARCH** always terminates for finite graphs.

Next we would like to show that if a path from  $s$  to a goal node exists, *A\** will terminate even for infinite graphs. To do so, let us suppose the opposite, that *A\** does not terminate. Termination is prevented only if new nodes are forever added to *OPEN*. But in this case we can show that even the smallest of the  $f$  values of the nodes on *OPEN* will grow impossibly large.

Let  $d^*(n)$  be the length of the shortest path in the implicit graph being searched from  $s$  to any node  $n$  in the search tree produced by *A\**. Then since the cost of each arc in the graph is at least some small positive number  $e$ ,  $g^*(n) \geq d^*(n)e$ . (Recall that  $g^*(n)$  is the cost of the optimal path from  $s$  to  $n$ , and that  $g(n)$  is the cost of the path in the search tree from  $s$  to node  $n$ .) Clearly,  $g(n) \geq g^*(n)$ , and thus  $g(n) \geq d^*(n)e$ . If  $h(n) \geq 0$  (which we henceforth assume),  $f(n) \geq g(n)$ , and thus  $f(n) \geq d^*(n)e$ . In particular, for every node  $n$  on *OPEN*, the value of  $f(n)$  is at least as large as  $d^*(n)e$ . Even though *A\** selects for expansion that node on *OPEN* whose  $f$  value is smallest, the node selected will ultimately have an arbitrarily large value of  $d^*$  and therefore also of  $f$  if *A\** does not terminate.

Now, to show that *A\** must eventually terminate, we show that before termination of *A\**, there is always a node  $n$  on *OPEN* such that  $f(n) \leq f^*(s)$ . Let the ordered sequence  $(s = n_0, n_1, \dots, n_k)$ , where  $n_k$  is a goal node, be an optimal path from  $s$  to a goal node. Then, for any time before *A\** terminates, let  $n'$  be the first node in this sequence that is on *OPEN*. (There must be at least one such node, because  $s$  is on *OPEN* at the beginning and if  $n_k$  is on *CLOSED*, *A\** has terminated.) By the definition of  $f$  for *A\**, we have

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

We know that *A\** has already found an optimal path to  $n'$  since  $n'$  is on an optimal path to a goal and all of the ancestors on this path are on *CLOSED*. Therefore,  $g(n') = g^*(n')$  and

$$f(n') = g^*(n') + h(n').$$

Since we are assuming  $h(n') \leq h^*(n')$ , we can write

$$f(n') \leq g^*(n') + h^*(n') = f^*(n').$$

Lemma  
yet to  
be proved