

* Uniform Cost Search

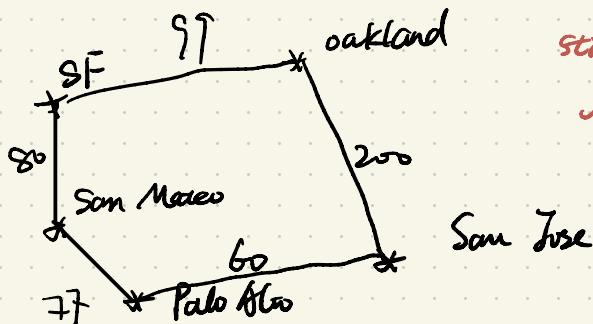
- * Complete
- * optimal
- priority queue ordered by path cost function $g(n)$
- check whether a node is a goal node

speed up the process of finding the optimal solution

Informed Search Algorithms

heuristic function : $h(n)$

estimate cost from node n to a goal node



straight distance between
line Oakland \leftrightarrow SJ
 $SF \leftrightarrow SJ$

heuristic function by itself is not a good candidate as we will lose optimality example above: Los Gatos would have been selected over Santa Clara since $h(\text{Los Gatos}) < h(\text{SC})$

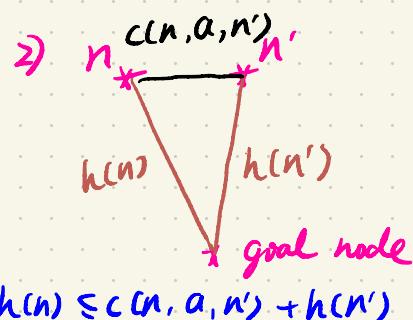
Let's combine the path cost function $g(n)$ and a heuristic function $h(n)$

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

↓ ↓ →
 total path ast estimated cost
 estimated start → n from n to cost
 cost from
 start to goal
 going through n

Conditions on $h(n)$ to still get optimality

1) heuristic is admissible if it does not over estimate the actual cost



n' : Successor of node n that you get by applying an action a

$$h(n) \leq c(n, a, n') + h(n')$$

$c(n, a, n')$: actual cost of going from node n to node n' by applying an action a

Assuming (by contradiction) that $h(n) > c(n, a, n') + h(n')$

\Rightarrow overestimating the cost from n to goal node

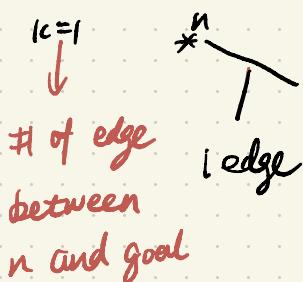
\Rightarrow we want $h(n)$ to not be an overestimate

Condition: A heuristic has to be consistent which means that for any node n and any successor n' of n , we must have $h(n) \leq c(n, a, n') + h(n')$

Exercise: Show that a consistent heuristic is admissible
(induction)



Base Case



$$h(n) \leq c(n, a, \text{goal}) + h(\text{goal})$$

$$\Rightarrow h(n) \leq c(n, a, \text{goal})$$

\downarrow
estimated cost
 $n \rightarrow \text{goal}$

\downarrow
actual cost
 $n \rightarrow \text{goal}$

\Rightarrow base case is proven

Induction step

Assume that if node n is d edges away from the goal node ($k=d$), then estimated cost < actual cost

we want to show that the property will still hold if n is $d+1$ edges away from the goal node

edge away ($k = d+1$)

Let $c(n)$ = actual cost from node n to a goal node

Assume $h(n') \leq c(n')$ for any node n' that is d edges away from goal.

Show $h(n) \leq c(n)$ for any node n that is $d+1$ edges away from goal

Let's first start by finding another expression for $c(n)$

$$f(n) \text{ (wt)}$$

$$c(n) = \min_{n' \in \text{neighbours}(n)} c(n, a, n') + c(n')$$

$h(n) \leq \underline{c(n, a, n') + h(n')}$ for any neighbor n' of n

$h(n') \leq c(n')$ (Induction hypothesis)
 $n' = d$ steps away from the goal

$$h(n) \leq c(n, a, n') + h(n') \leq c(n, a, n') + c(n')$$

true for every node n'

must also be true for the node n' that minimizes the quantity
 $c(n, a, n') + c(n')$

$$\Rightarrow h(n) \leq \min_{n' \in \text{neighbours}(n)} c(n, a, n') + c(n')$$

$$\Rightarrow h(n) \leq c(n)$$

I mainly need to check for consistency to get a valid heuristic

Why is it that a consistent heuristic will lead to an optimal Solution