### Cost function g

- actual cost from s to v along the cheapest path found so far
  - $\blacksquare$  exact cost if G is a tree
  - can never underestimate the cost if *G* is a general graph
- f(v) = g(s, v) and unit cost  $\rightarrow$  breadth-first search
- f(v) = -g(s, v) and unit cost  $\rightarrow$  depth-first search

#### Heuristic function h

- carries information from outside the graph
- defined for the problem domain
- the closer to the actual cost, the less superfluous vertices are expanded
- f(v) = g(s, v) → cheapest-first search
- f(v) = h(v, r) → best-first search

### Admissibility

- let Algorithm A be a best-first search using the evaluation function *f*
- search algorithm is *admissible* if it finds the minimal path (if it exists)
  - if  $f = f^*$ , Algorithm A is admissible
- Algorithm A\* = Algorithm A using an estimate function *b* 
  - A\* is admissible, if h does not overestimate the actual cost

### Monotonicity

- b is locally admissible  $\rightarrow b$  is monotonic
- monotonic heuristic is also admissible
- actual cost is never less than the heuristic cost
   → f will never decrease
- monotonicity → A\* finds the shortest path to any vertex the first time it is expanded
  - if a vertex is rediscovered, path will not be shorter
  - simplifies implementation

## **Optimality**

- Optimality theorem: The first path from *s* to *r* found by A\* is optimal.
- Proof: lecture notes p. 49

#### Informedness

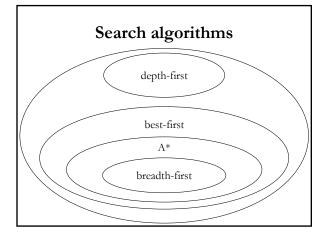
- the more closely h approximates  $h^*$ , the better  $A^*$  performs
- if A<sub>1</sub> using b<sub>1</sub> will never expand a vertex that is not also expanded by A<sub>2</sub> using b<sub>2</sub>, A<sub>1</sub> is more informed that A<sub>2</sub>
- informedness → no other search strategy with the same amount of outside knowledge can do less work than A\* and be sure of finding the optimal solution

## Algorithm A\*

- because of monotonicity
  - all weights must be positive
  - closed list can be omitted
- the path is constructed from the mapping  $\pi$  starting from the goal vertex
  - $\blacksquare s \to \dots \to \pi(\pi(\pi(r))) \to \pi(\pi(r)) \to \pi(r) \to r$

#### **Practical considerations**

- computing *h* 
  - despite the extra vertices expanded, less informed h
    may yield computationally less intensive
    implementation
- suboptimal solutions
  - by allowing overestimation A\* becomes inadmissible, but the results may be good enough for practical purposes



# Realizing the movement

- movement through the waypoints
  - unrealistic: does not follow the game world geometry
  - aesthetically displeasing: straight lines and sharp turns
- improvements
  - hierarchical pathing
  - line-of-sight testing
- combining path finding to user-interface
  - real-time response

# Recapitulation

- discretization of the game world
  - grid, navigation mesh
  - waypoints, connections, costs
- path finding in a graph
  - Algorithm A\*
- realizing the movement
  - geometric corrections
  - aesthetic improvements

### Question

- Although this is the *de facto* approach in (commercial) computer games, are there alternatives?
- possible answers
  - AI processors (unrealistic?)
  - robotics: reactive agents (unintelligent?)
  - analytical approaches (inaccessible?)