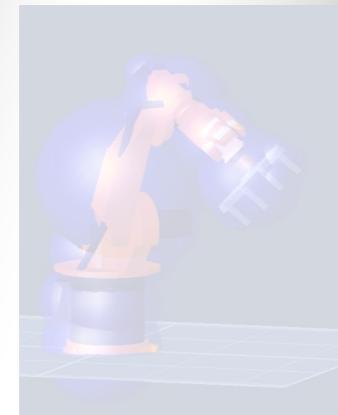
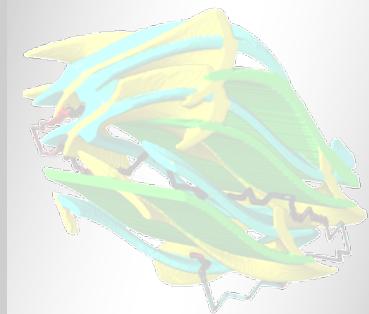
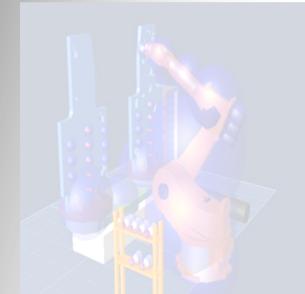
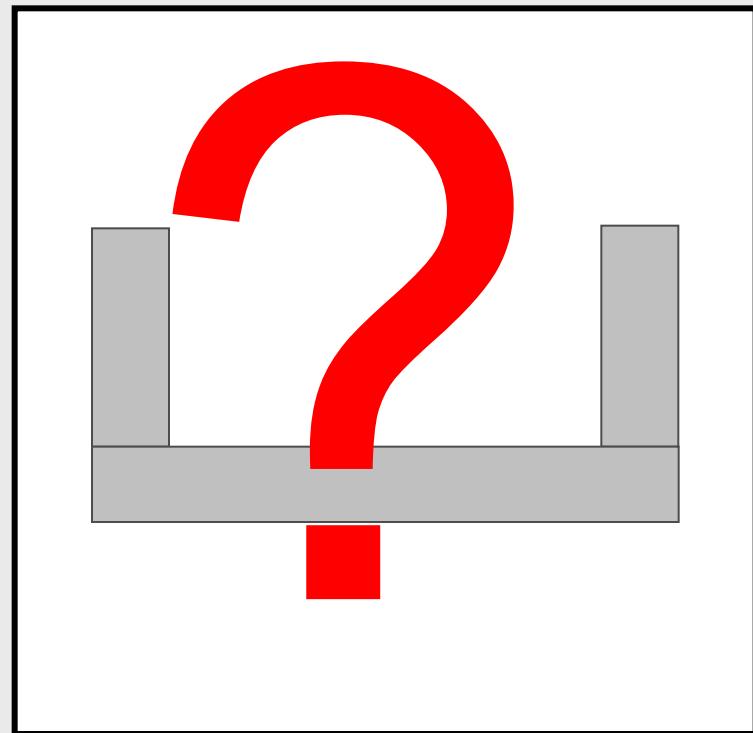


# A\* - Algorithm for path planning



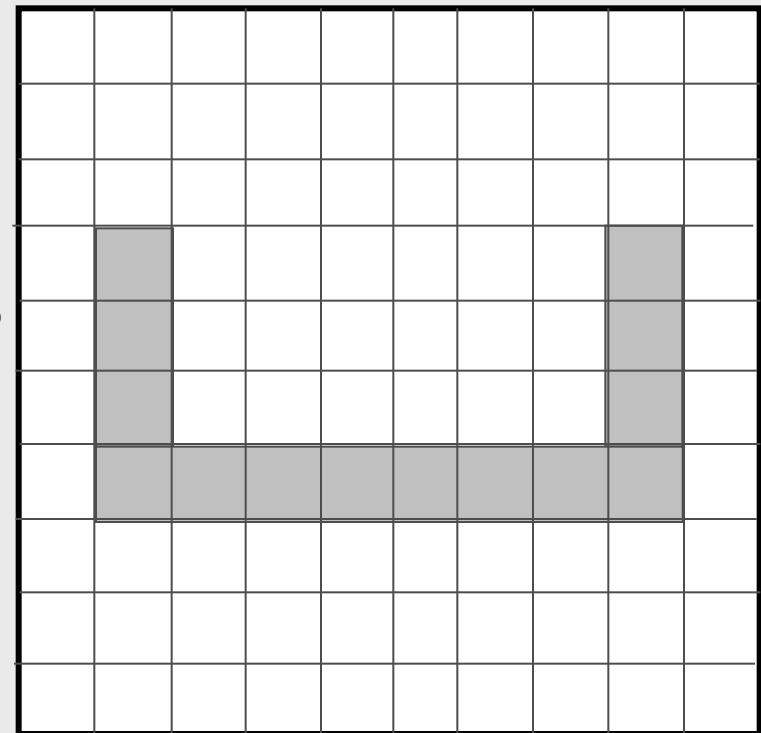
# Discretisation of C-space

- ▶ To use an A\*-algorithm as path planning algorithm, C-space must be discretized.



# Discretisation of C-space

- ▶ To use an A\*-algorithm as path planning algorithm, C-space must be discretized.
- ▶ After discretisation C-space can be interpreted as a grid on which A\* can „take place“
- ▶ The joint values are transformed to **grid coordinates** based on joint limits and numbers of discretisation steps



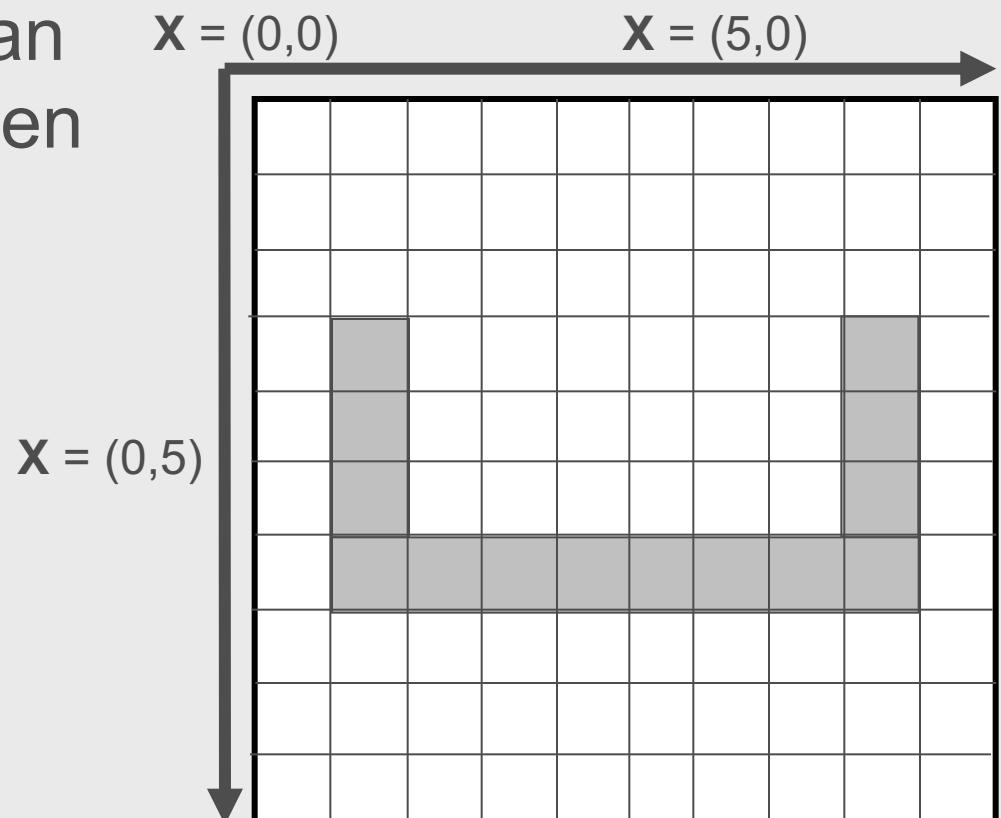
# Discretisation of C-space: grid coordinates

- ▶ Every grid coordinate corresponds exactly to one configuration
- ▶ Let  $\Delta\Theta_i$  the chosen discretisation and  $\Theta_{\min,i}$  the lower limit of joint i, then  $\varphi_i$  can be determined by a given grid coordinate  $x_i$ :

$$\varphi_i = \Theta_{\min,i} + \Delta\Theta_i x_i$$

- ▶ Other way around:

$$x_i = \left\lfloor \frac{\varphi_i - \Theta_{\min,i}}{\Delta\Theta_i} + \frac{1}{2} \right\rfloor$$



# A\* algorithm in more detail

```
procedure A* (S;G)
tNode : S;                                /* INPUT: Start node */
tNode : G;                                /* INPUT: Goal node */
begin
    tNode :     n;                         /* Temporary node */
    tNodeList : s;                         /* Successor node list */
    tHeap :     OPEN;                      /* Nodes to be expanded */
    tHashtable : CLOSED;                  /* Nodes already expanded */
    tBoolean :   goalFound;                /* TRUE, if Goal is found */
    init (OPEN;CLOSED; S) ;
    goalFound = FALSE;
    while (OPEN ≠ Ø) do begin
        n = best (OPEN) ;
        if (n == G) then
            goalFound = TRUE;
            break;
        endif
        s = expandNode (n) ;
        handleSuccessors (OPEN;CLOSED; s) ;
    end
    if (goalFound == TRUE) then
        printSolution (: : : ) ;
    endif
    return (goalFound) ;
end;
```

# A\* algorithm in more detail

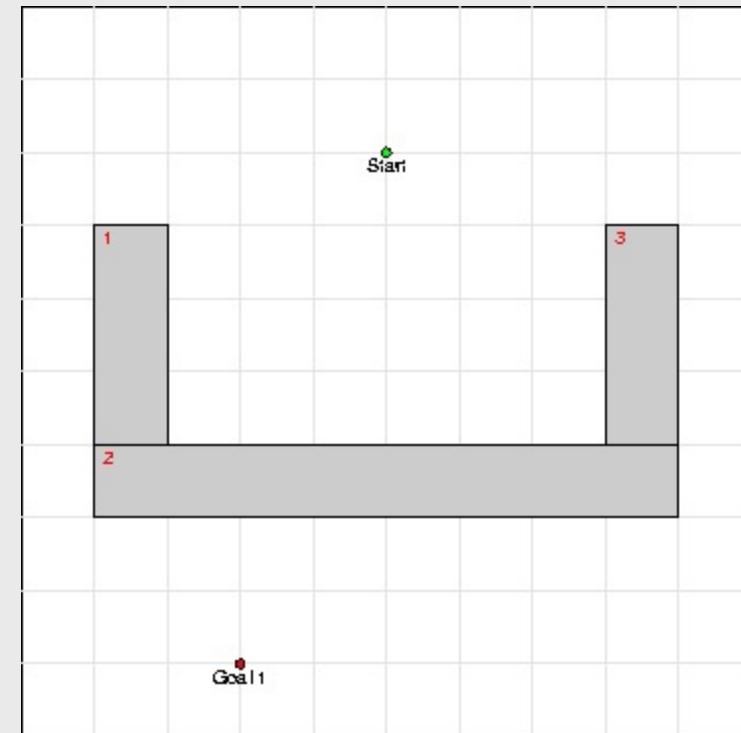
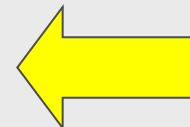
```
procedure bestfirst (S;G)
tNode : S;                                /* INPUT: Start node */
tNode : G;                                /* INPUT: Goal node */
begin
    tNode :     n;                         /* Temporary node */
    tNodeList : s;                         /* Successor node list */
    tHeap :    OPEN;                        /* Nodes to be expanded */
    tHashtable : CLOSED;                   /* Nodes already expanded */
    tBoolean : goalFound;                 /* TRUE, if Goal is found */
    init (OPEN;CLOSED; S) ;
    goalFound = FALSE;
    while (OPEN ≠ Ø) do begin
        n = best (OPEN) ;
        if (n == G) then
            goalFound = TRUE;
            break;
        endif
        s = expandNode (n) ;
        handleSuccessors (OPEN;CLOSED; s) ;
    end
    if (goalFound == TRUE) then
        printSolution (: : : : ) ;
    endif
    return (goalFound) ;
end;
```

Place to modify  
algorithm

# A\*-search

## ► Graph search (A\*) in implicit C-space

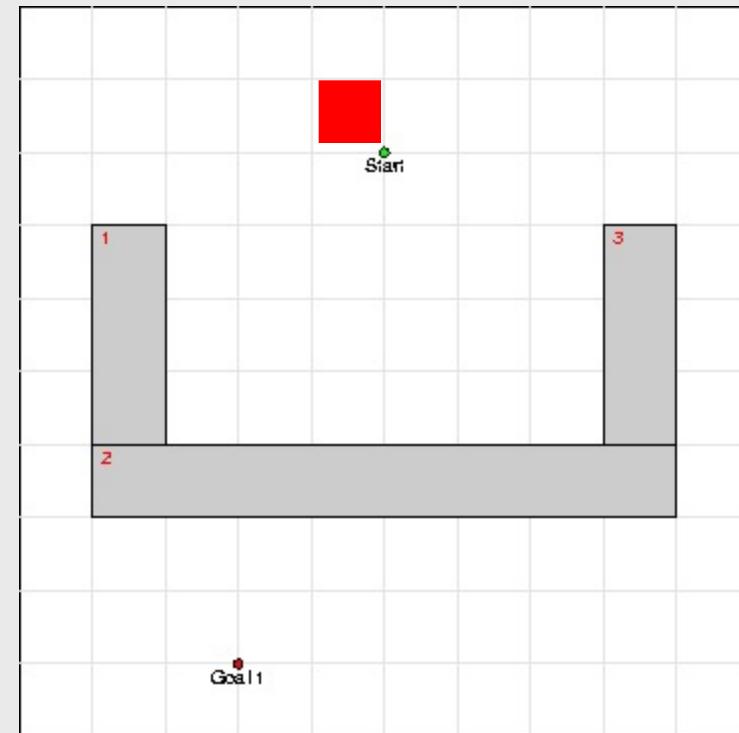
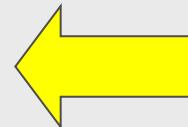
```
init (OPEN;CLOSED; S) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```



# A\*-search

- ▶ Graph search (A\*) in implicit C-space

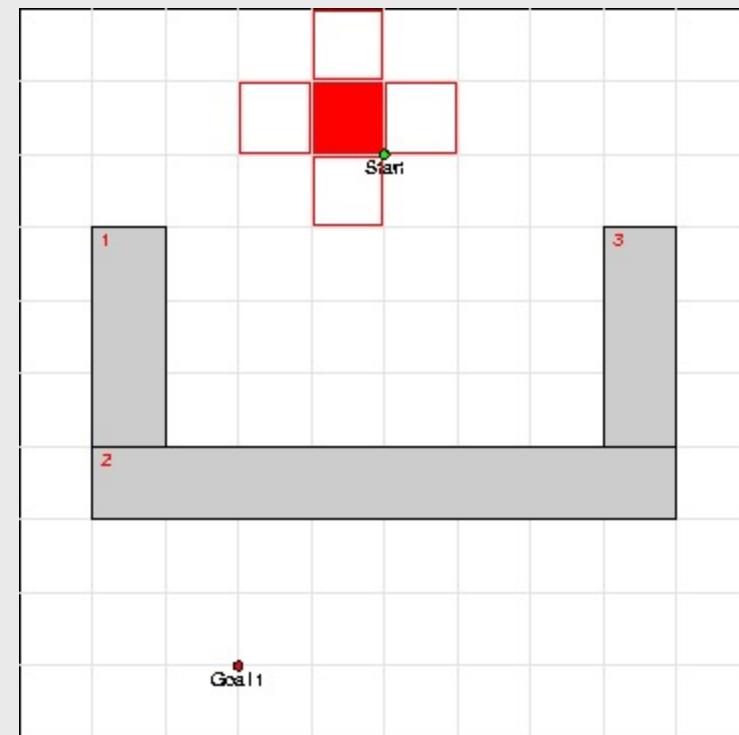
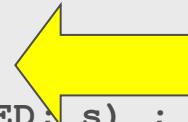
```
init (OPEN;CLOSED; S) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```



# A\*-search

- ▶ Graph search (A\*) in implicit C-space

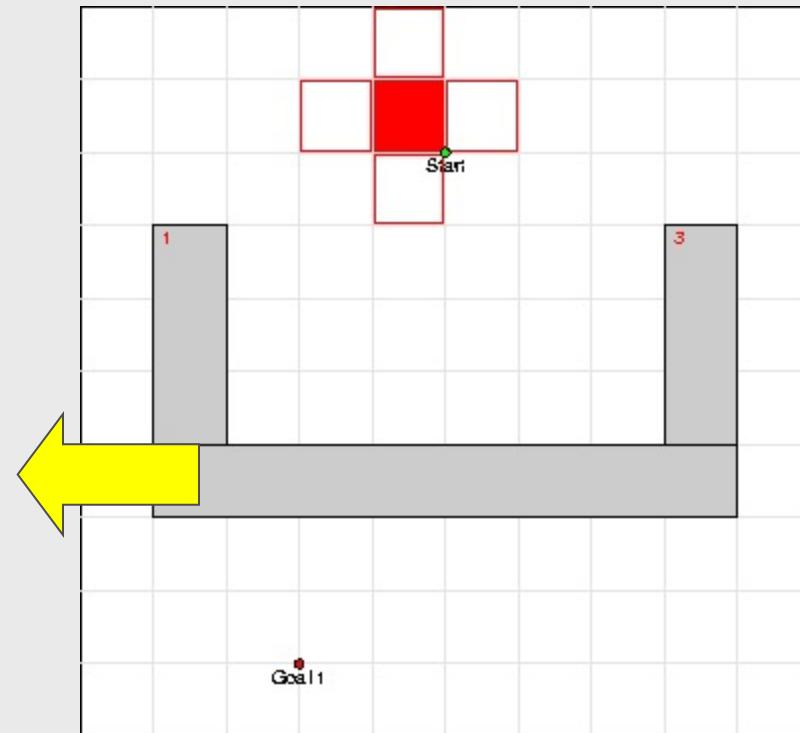
```
init (OPEN;CLOSED; S) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```



# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$

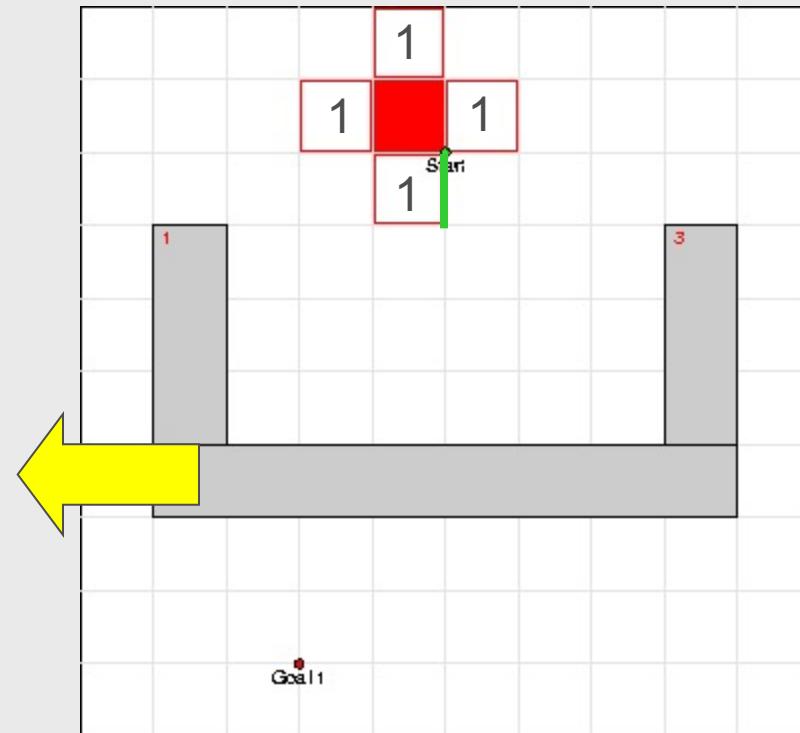
```
init (OPEN;CLOSED; s) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```



# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
 $f(n) = g(n) + h(n)$

```
init (OPEN;CLOSED; s) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```

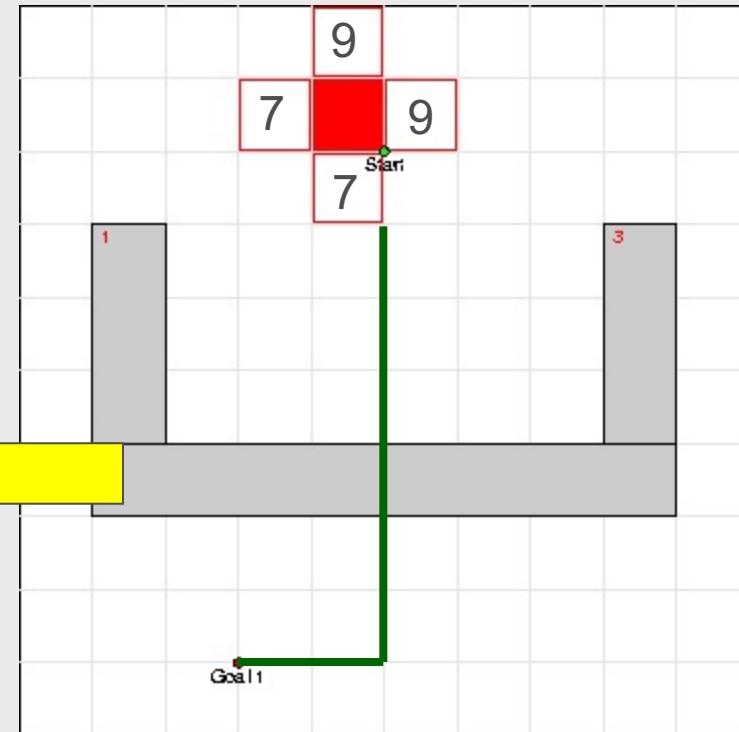


# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$

- ▶ Manhattan

```
init (OPEN;CLOSED; s) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```

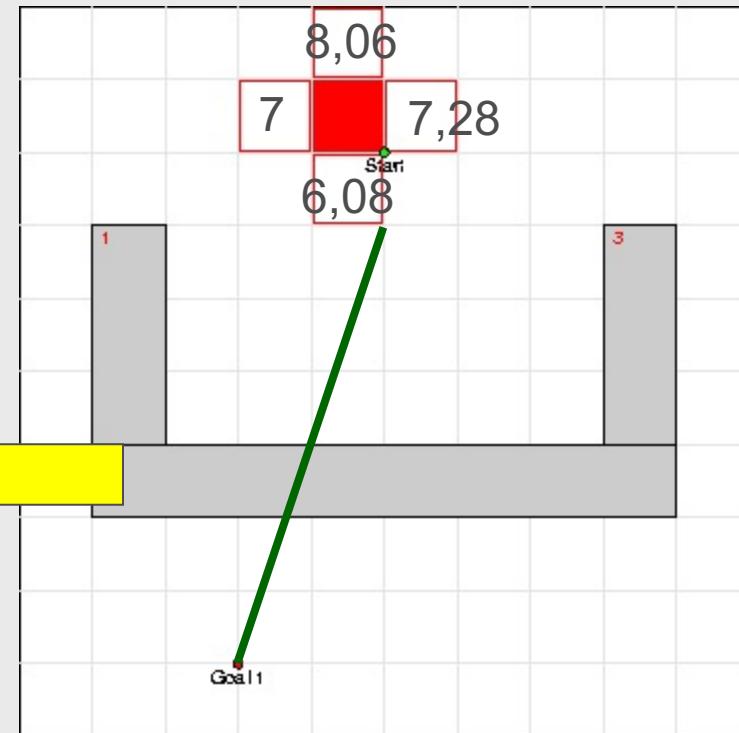


# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$

- ▶ Euclid

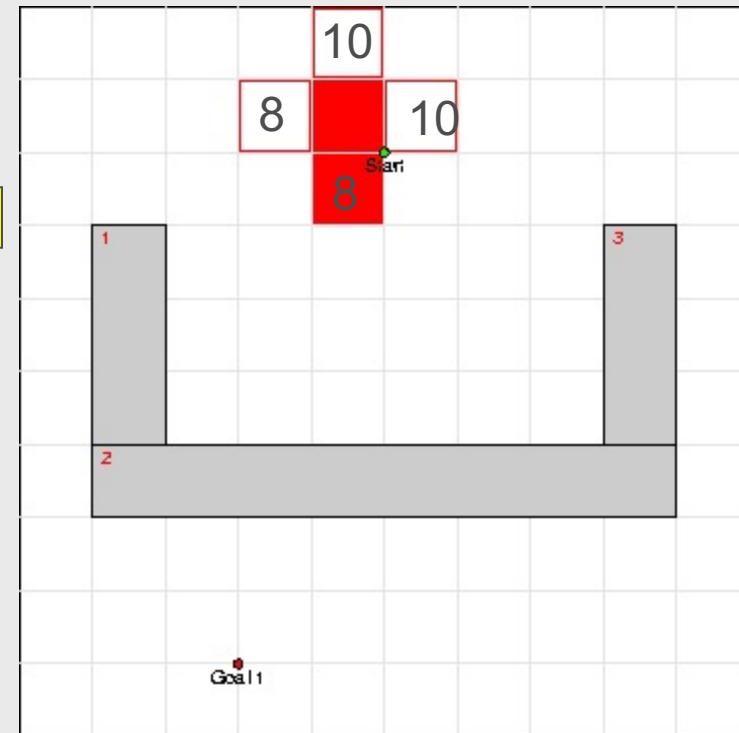
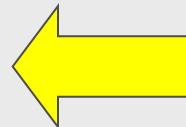
```
init (OPEN;CLOSED; s) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```



# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$

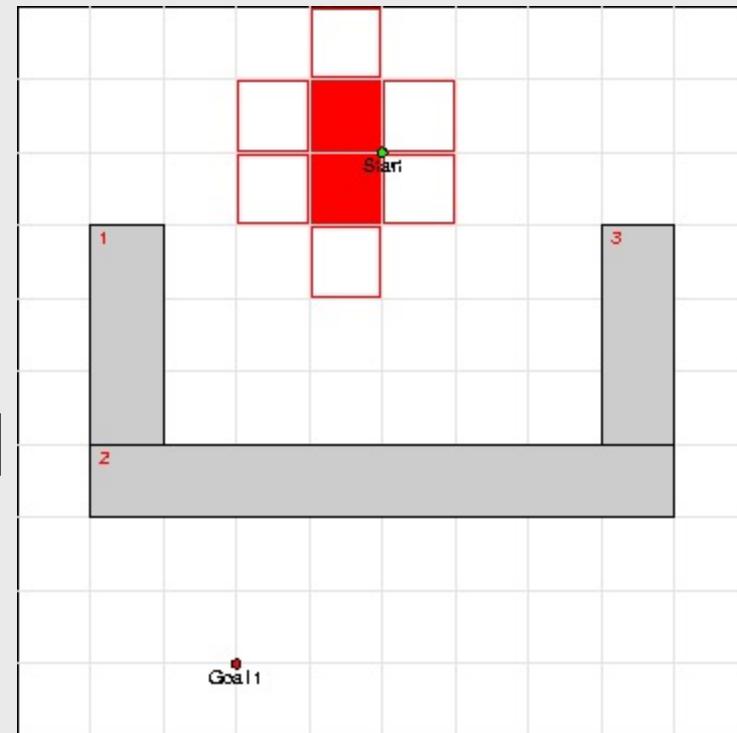
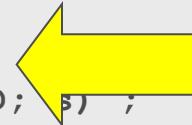
```
init (OPEN;CLOSED; s) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end
```



# A\*-search

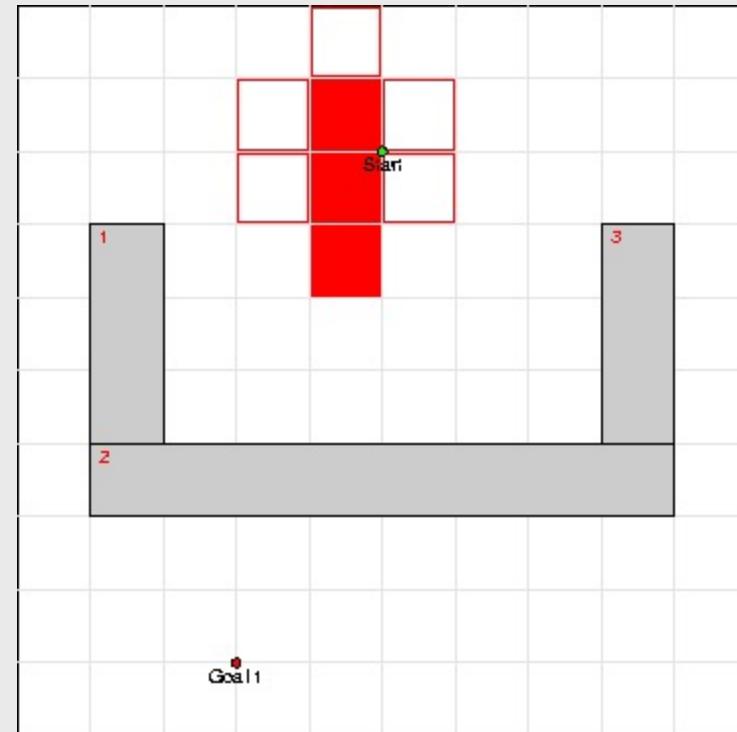
- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$

```
init (OPEN;CLOSED; S) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; S) ;  
end
```



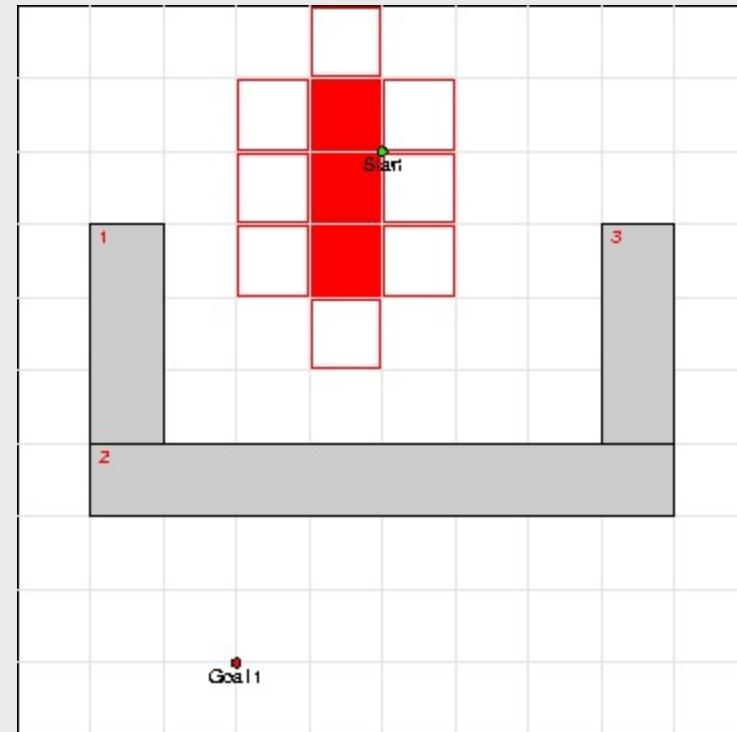
# A\*-search

- ▶ Graph search ( $A^*$ ) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



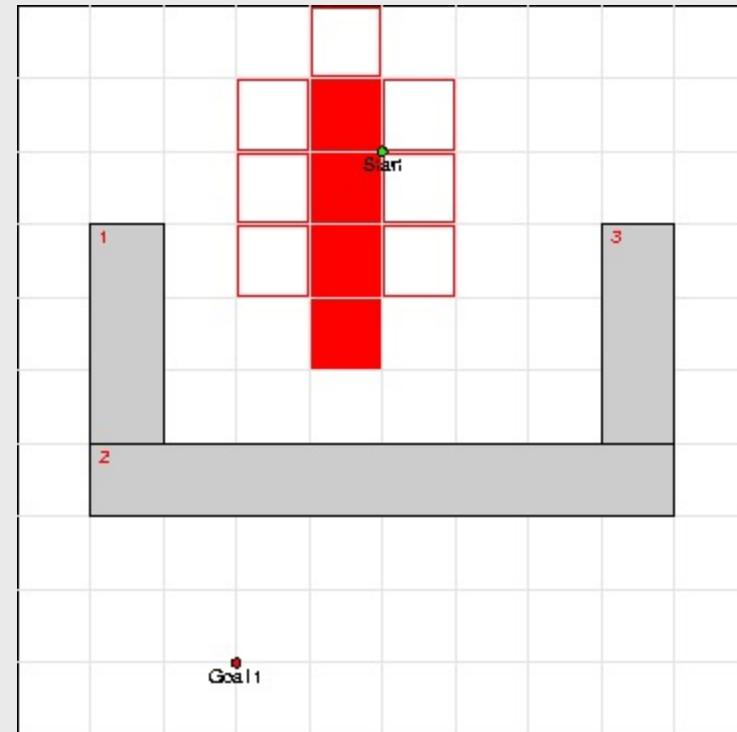
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



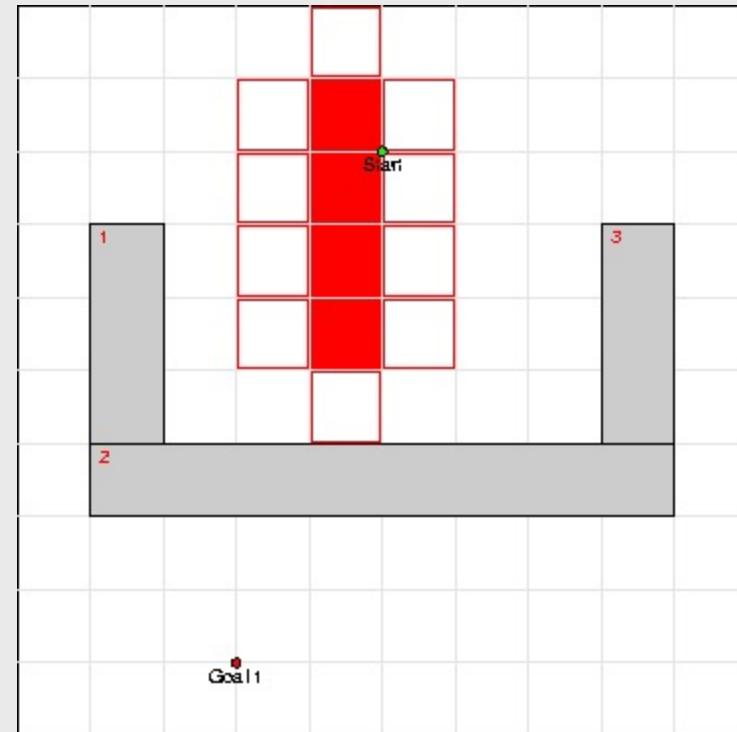
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



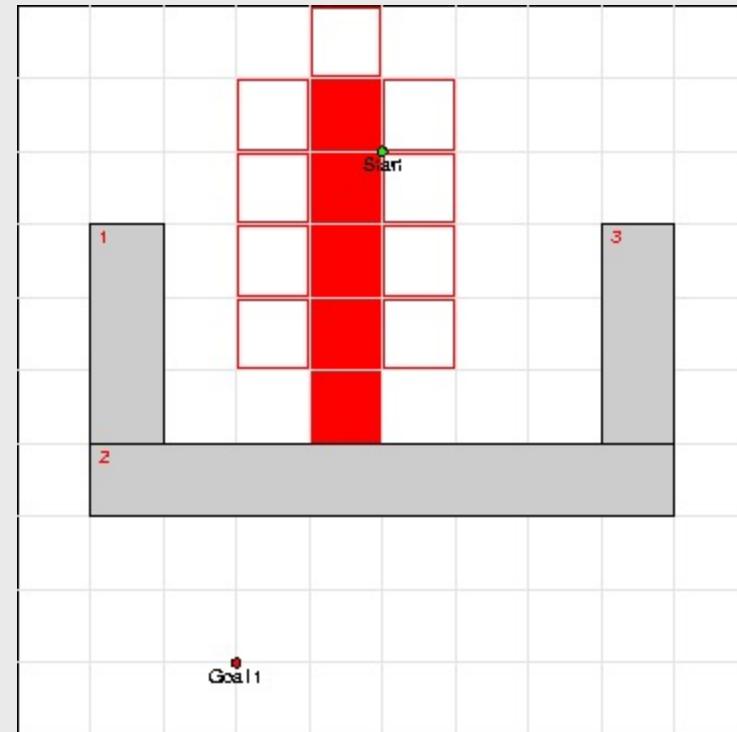
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



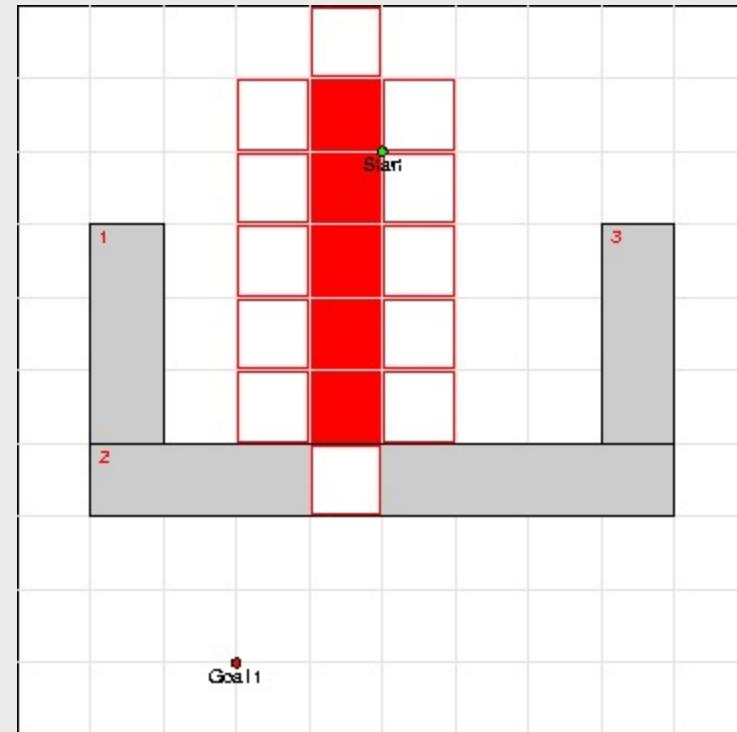
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



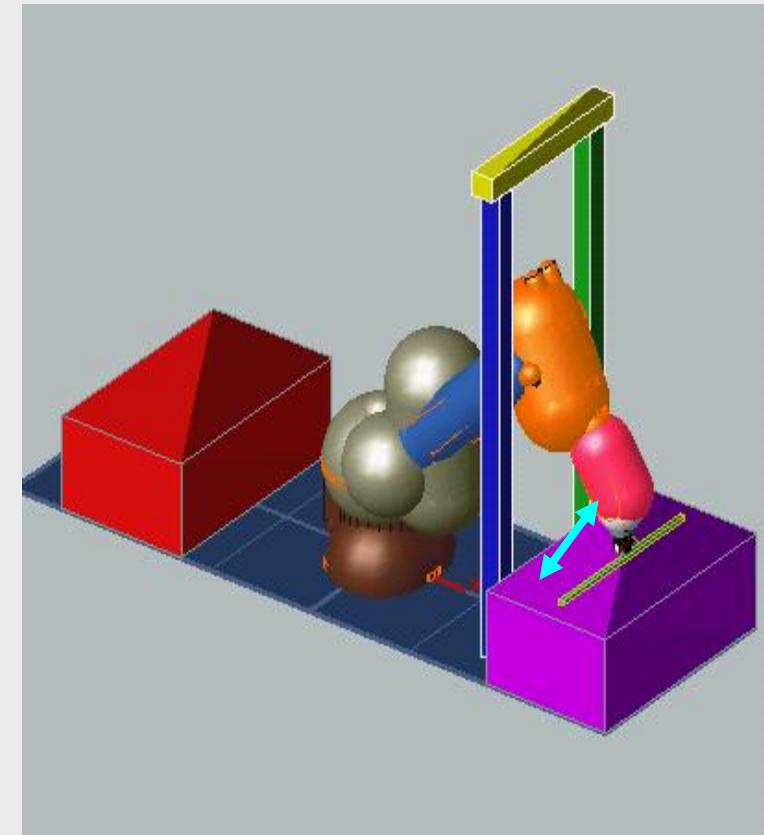
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



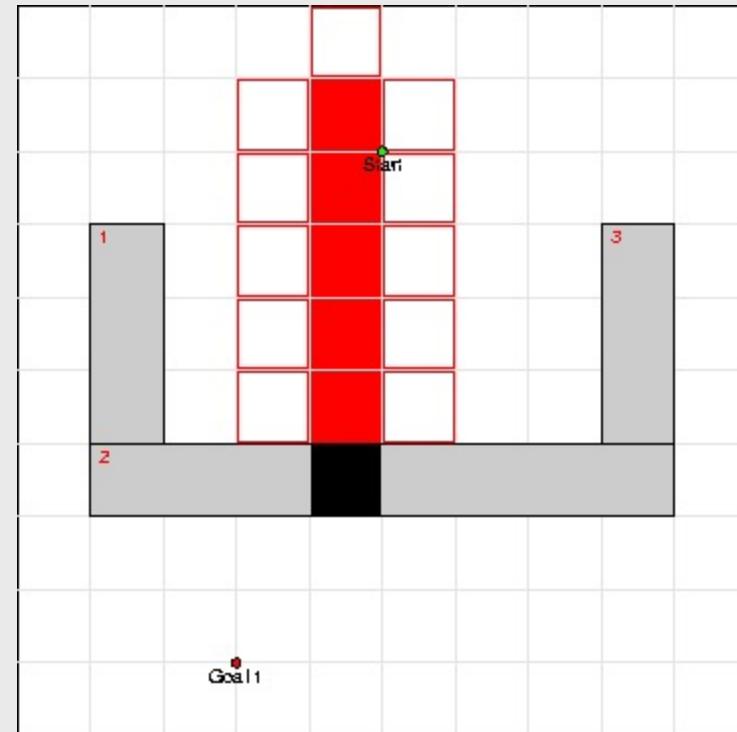
# Collision detection

- ▶ Convex hull of robot and obstacles
- ▶ Approximation with primitive
- ▶ Distance-Calculation with Gilbert-Johnson-Kerthi-Algorithm



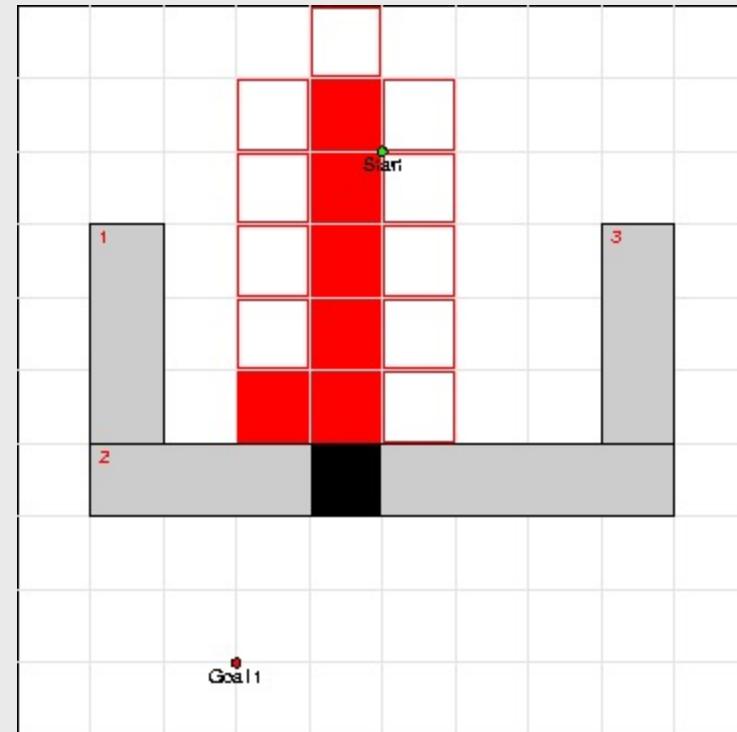
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



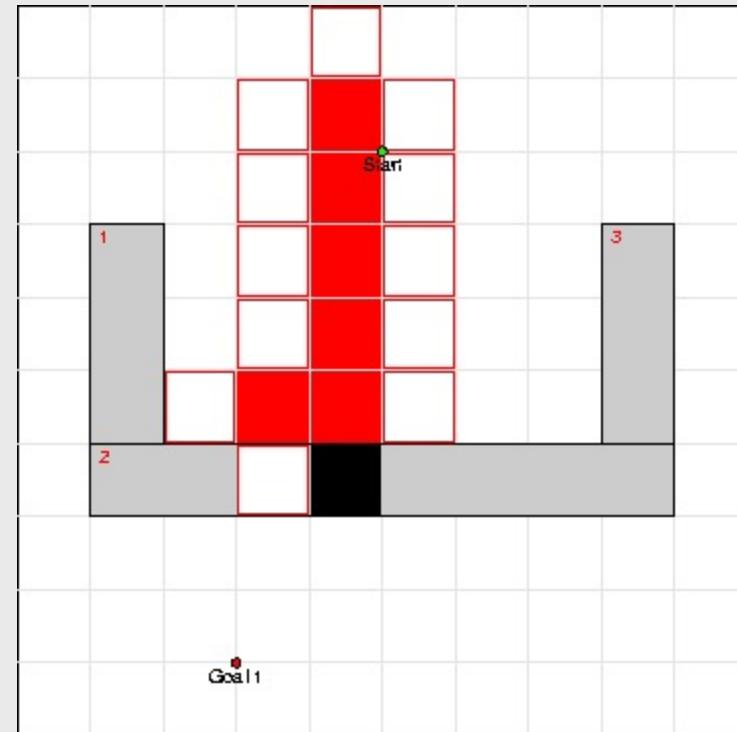
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



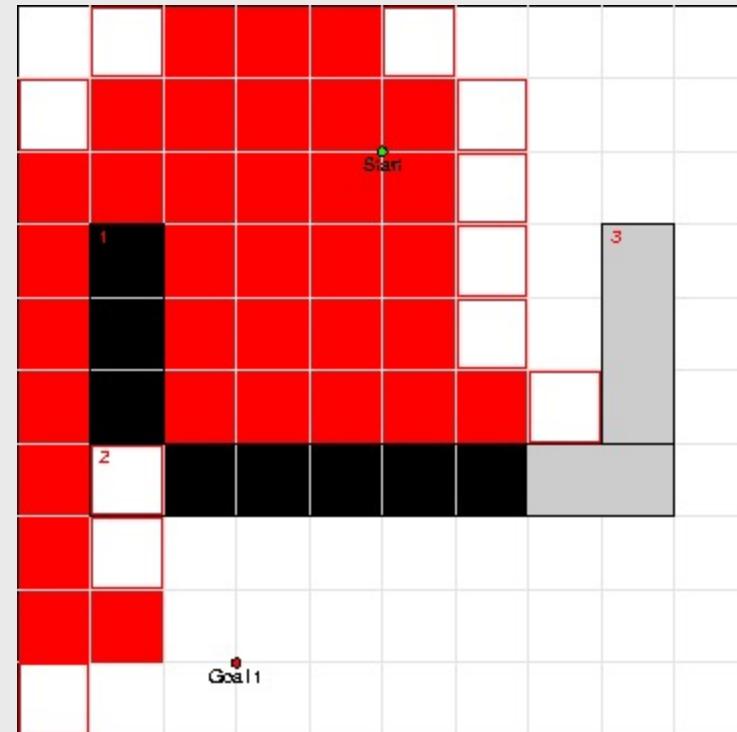
# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



# A\*-search

- ▶ Graph search (A\*) in implicit C-space
- ▶ Heuristic evaluation function  
$$f(n) = g(n) + h(n)$$



# A\*-search

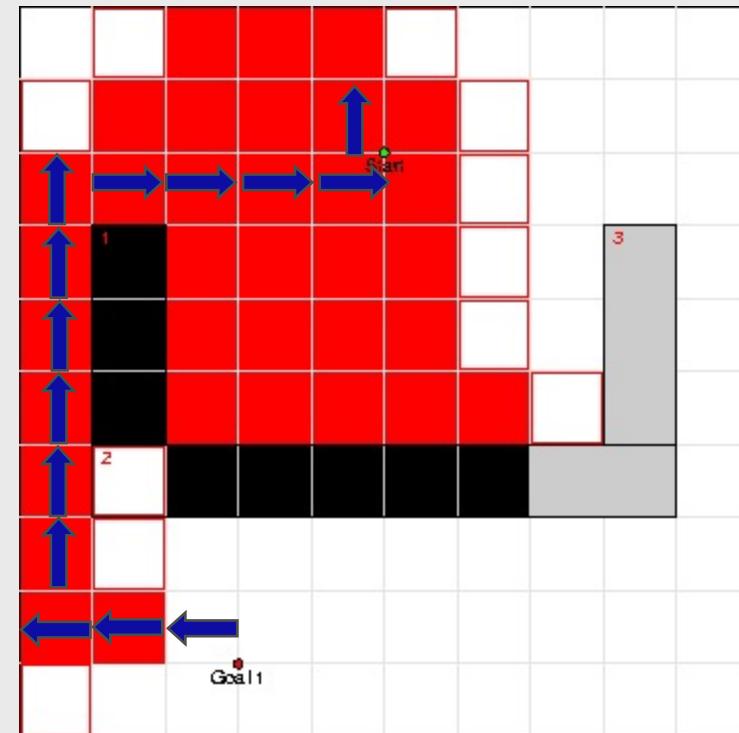
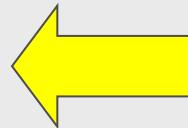
- ▶ Graph search (A\*) in implicit C-space

- ▶ Heuristic evaluation function

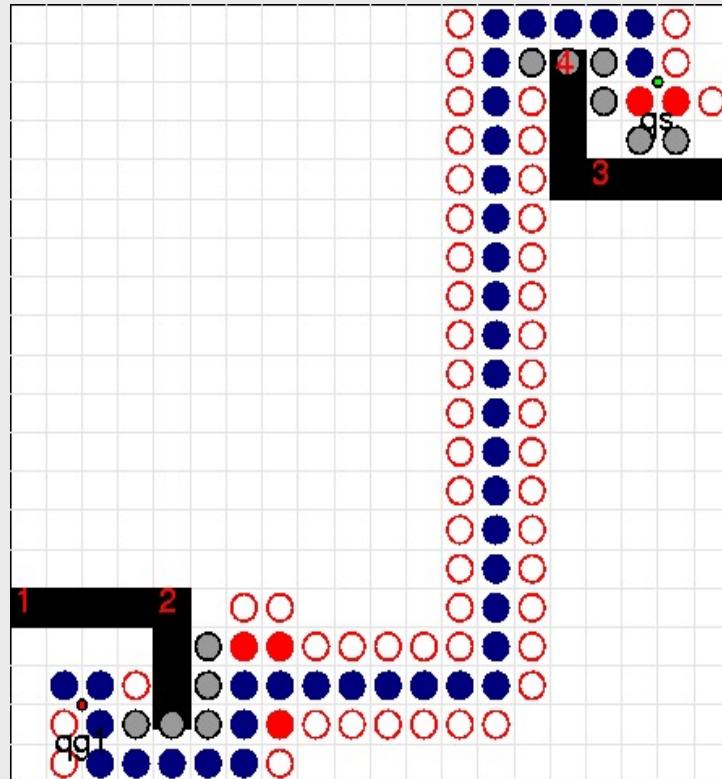
$$f(n) = g(n) + h(n)$$

- ▶ Collecting solution

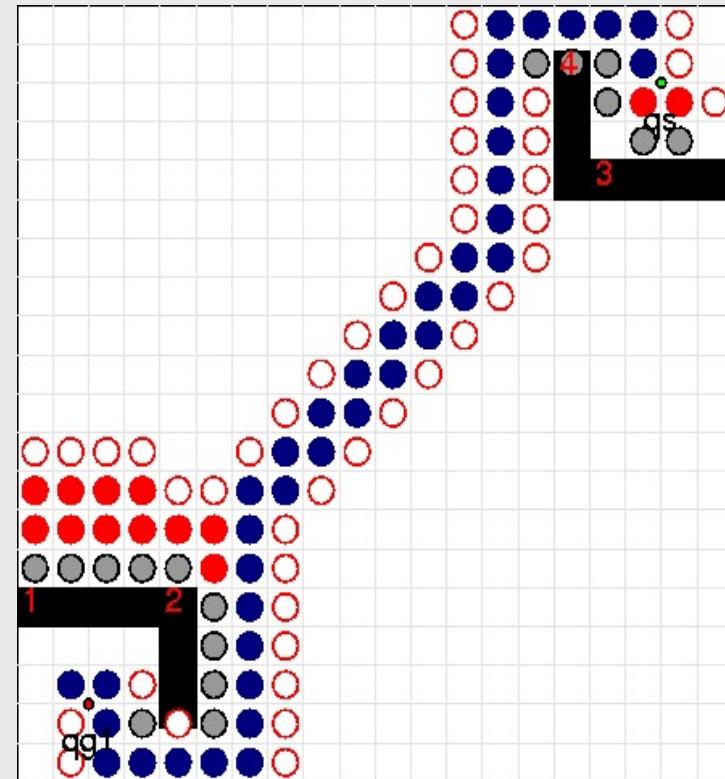
```
init (OPEN;CLOSED; s) ;  
goalFound = FALSE;  
while (OPEN ≠ Ø) do begin  
    n = best (OPEN) ;  
    if (n == G) then  
        goalFound = TRUE;  
        break;  
    endif  
    s = expandNode (n) ;  
    handleSuccessors (OPEN;CLOSED; s) ;  
end  
if (goalFound == TRUE) then  
    printSolution (: : : ) ;
```



# Comparison: Used Metrics



MANHATTAN



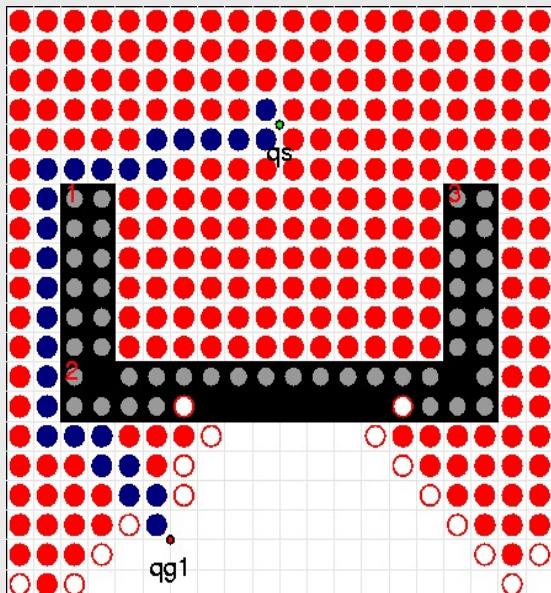
EUKLID

# Modifying evaluation function

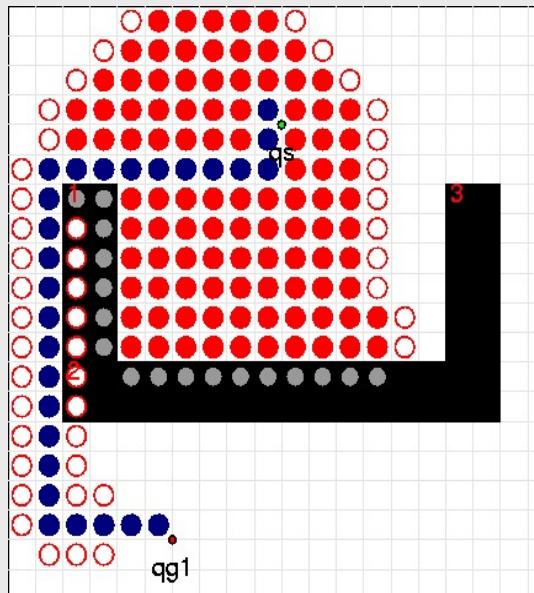
- ▶ Modified evaluation function:

$$f(n) = (1-w) * g(n) + w * h(n)$$

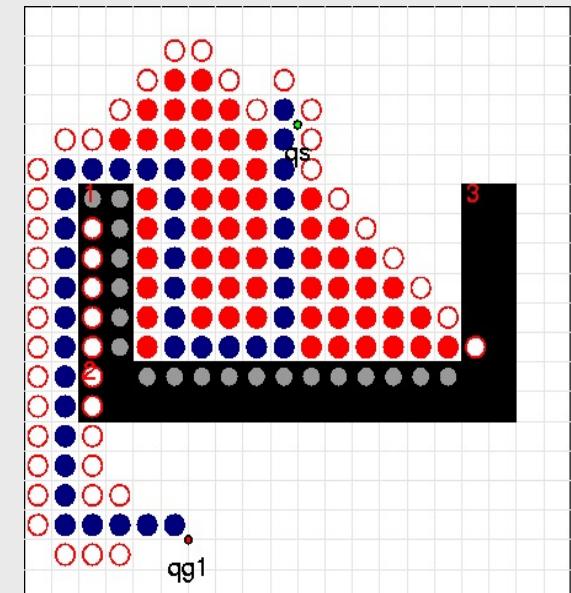
- ▶  $w$  : Heuristic weight



$w = 0$

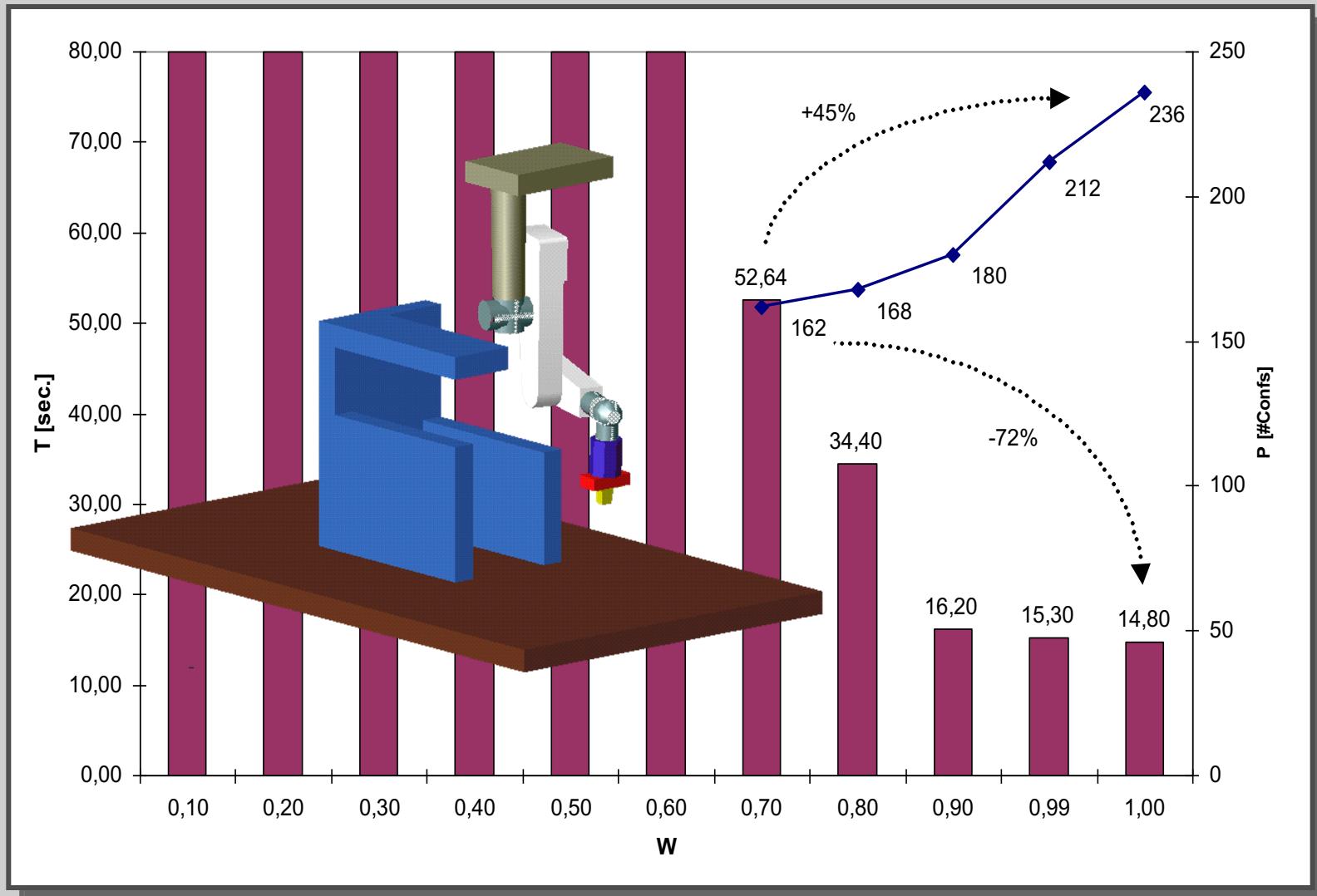


$w = 0.5$

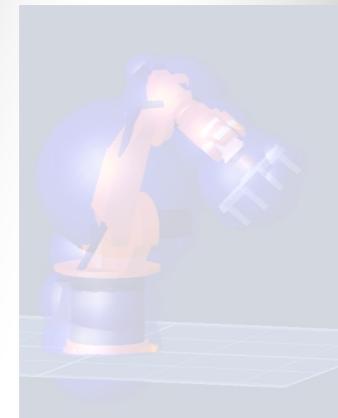
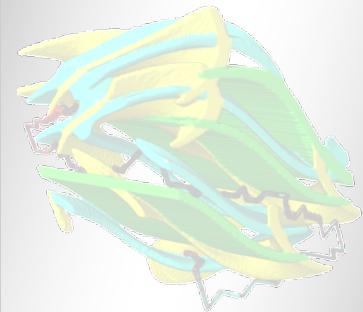
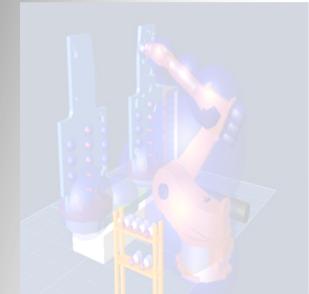


$w = 1$

# Heuristic weight (TRAP)



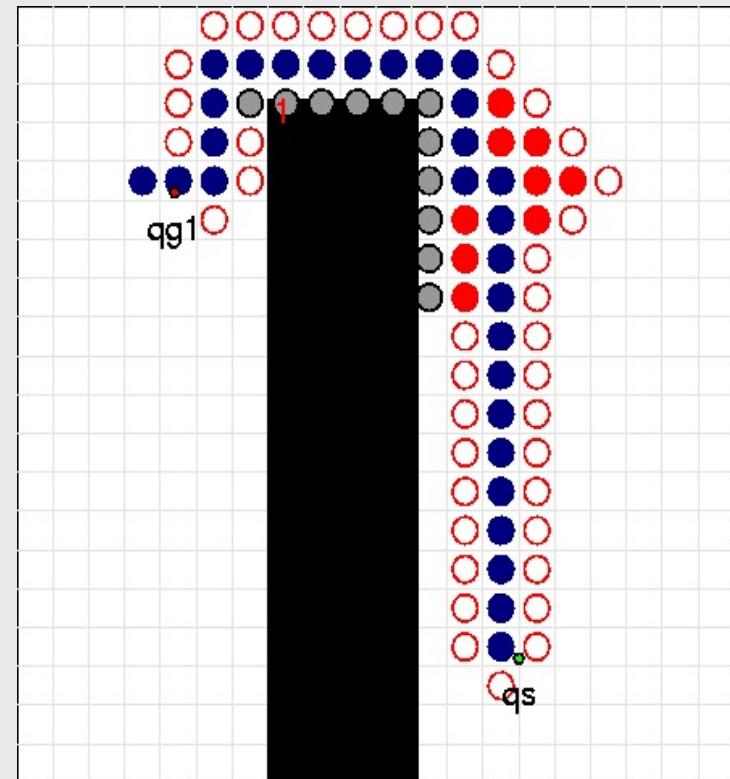
# Extensions of A\*



# Unidirectional search

## ▶ Problem

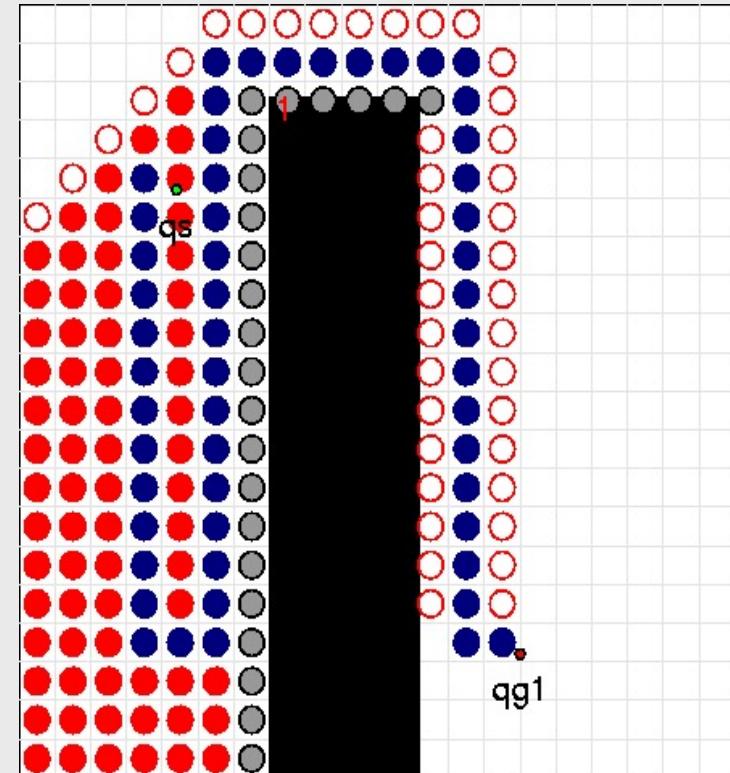
- ▶ Time needed to find solution is depending on **search direction**



# Other direction

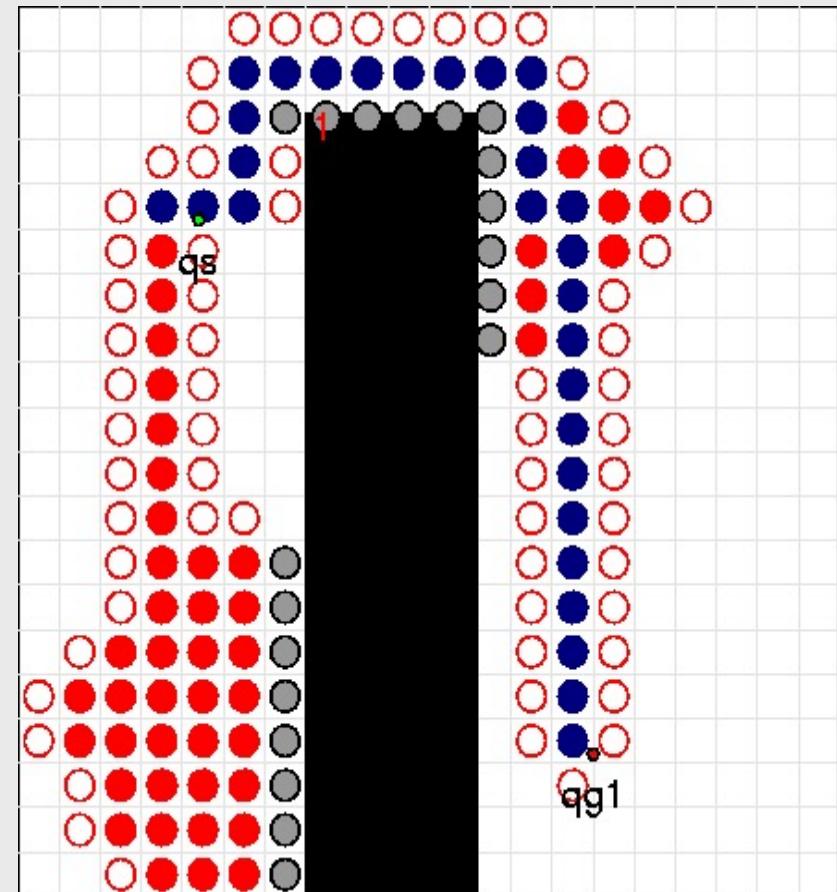
## ► Problem

- Time needed to find solution is depending on **search direction**



# Bidirectional search

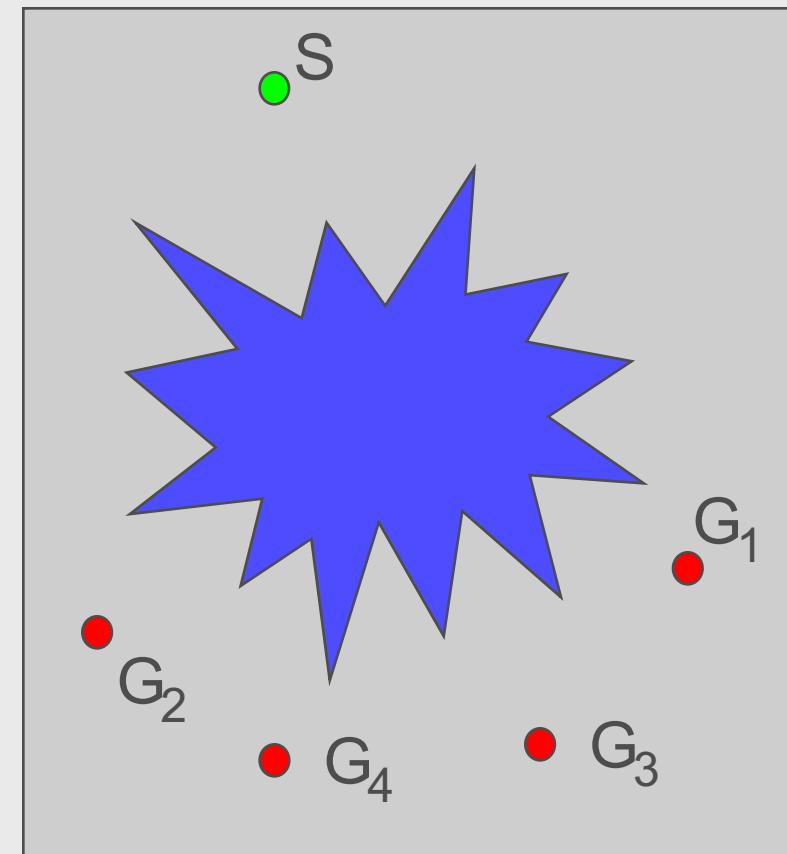
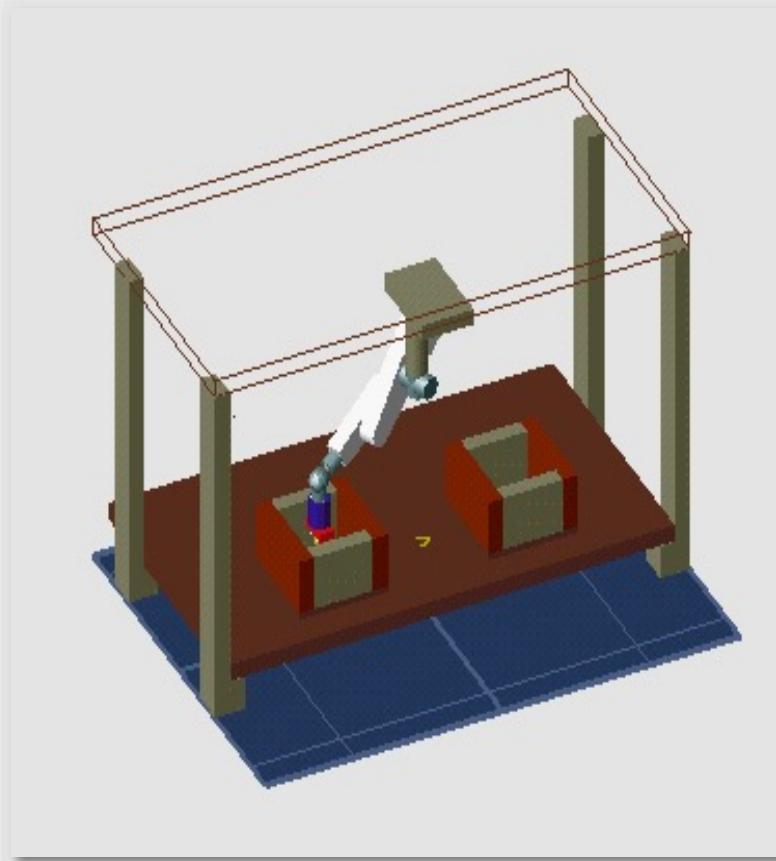
- ▶ Goal: combining forward and backward search
- ▶ Modifying A\*-algorithm:
  - ▶ Two **OPEN-Lists** covering forward- and backward search
  - ▶ **Nodes of the two lists** are alternatingly expanded
  - ▶ Search algorithm ends, if a duplicate in shared **CLOSED-List** is found



# Inverse kinematics: „More than one goal“

- ▶ Benchmark „STAR“:

- ▶ Goal configuration can be reached in 4 different ways



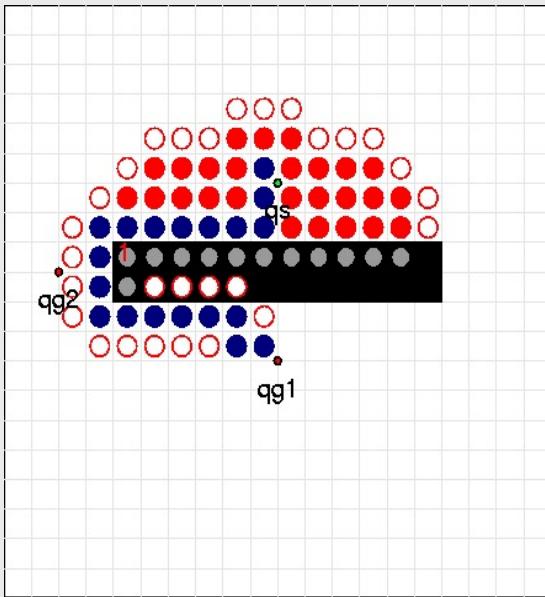
- ▶ How can this be used during search?

# Dynamic goal switching

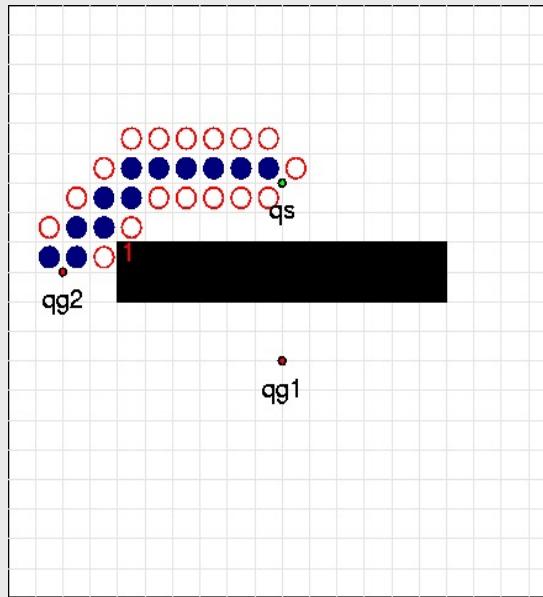
## Idea

- ▶ include all possible goal configurations given by inverse kinematics during search
- ▶ In `handleSuccessors (...)` heuristic value to all goals are evaluated
  - ▶ Search direction is always heading for the nearest goal
    - ▶ Current goal will automatically change during search if it seems better suited

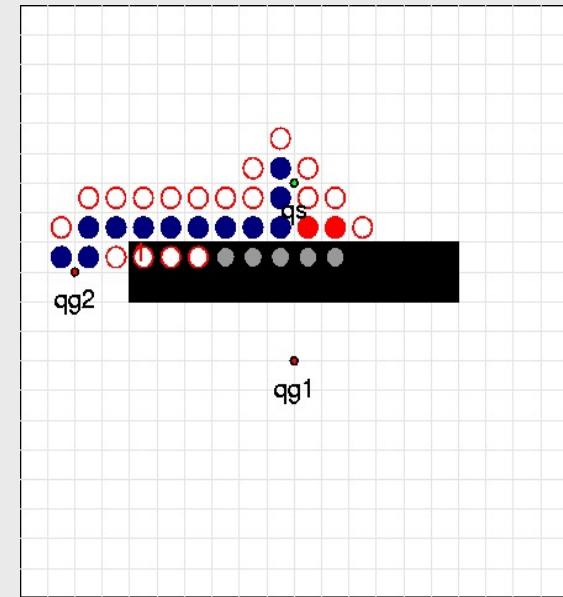
# Dynamic goal switching



$q_s \rightarrow q_{g1},$   
**no** goal switching  
Nodes: 55



$q_s \rightarrow q_{g2},$   
**no** goal switching  
Nodes: 12



$q_s \rightarrow q_{g1} \& q_{g2},$   
**goal switching**  
Nodes: 19

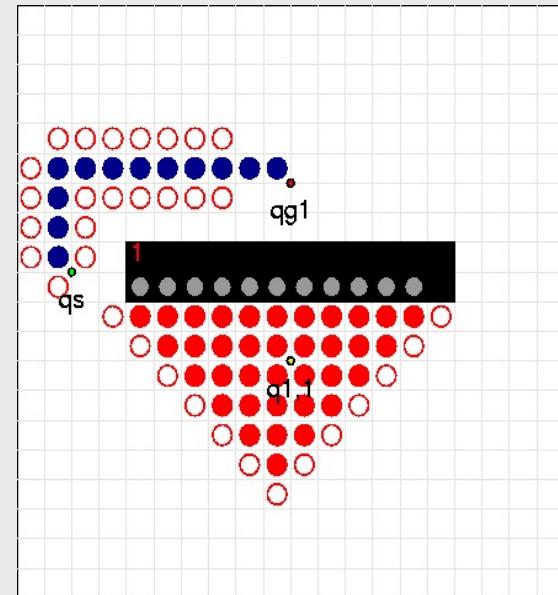
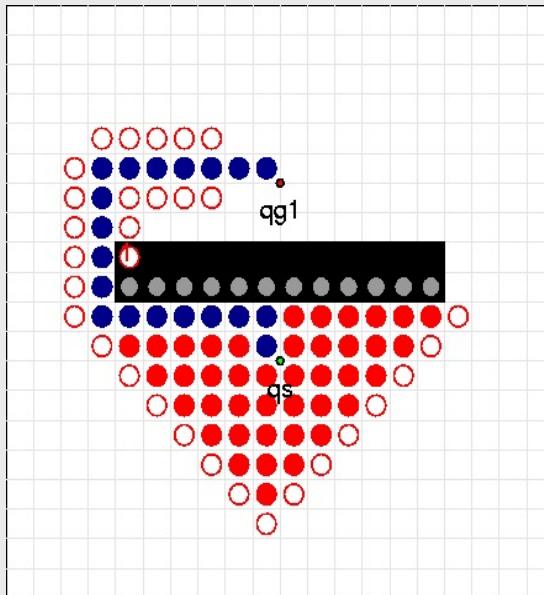
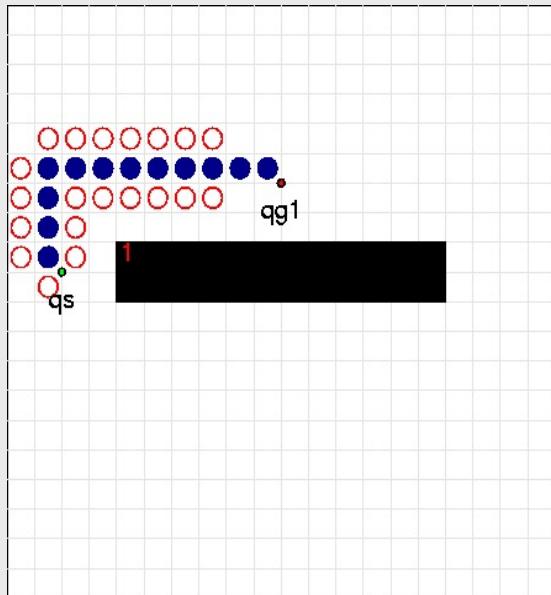
# Dynamic start switching

- ▶ Goal switching works fine!
- ▶ Use same thing for start

## Idea

- ▶ Insert all start configurations into OPEN-List
- ▶ Let A\* automatically choose best one

# Dynamic start switching



$q_s \rightarrow q_{g1}$ ,

**no start switching**

Nodes: 12

$q_{s2} \rightarrow q_{g2}$ ,

**no start switching**

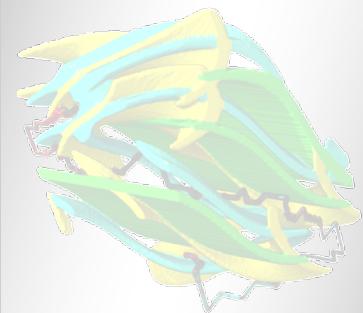
Nodes: 72

$q_{s1} \& q_{s2} \rightarrow q_{g1}$ ,

**start switching**

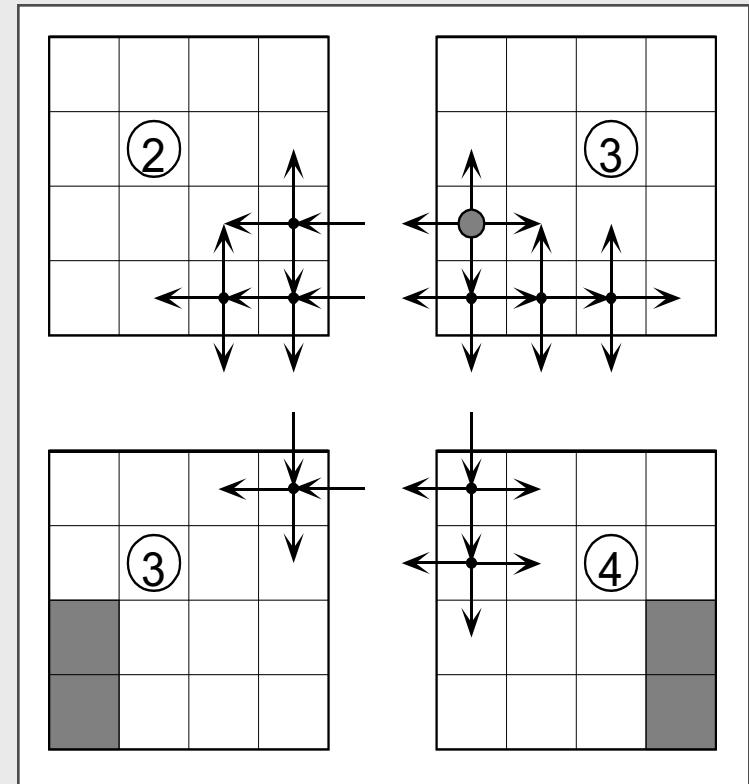
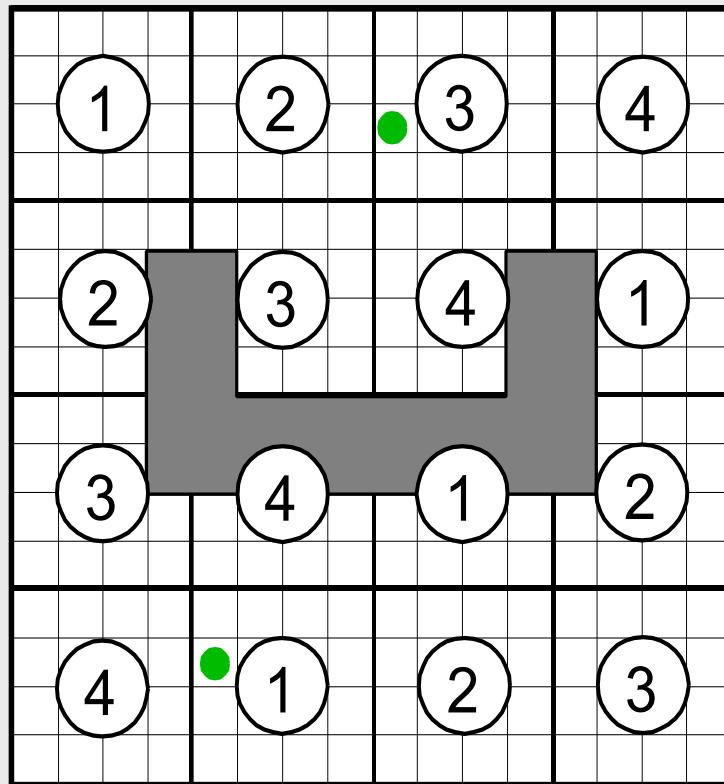
Nodes: 59

# Parallel A\*-Search



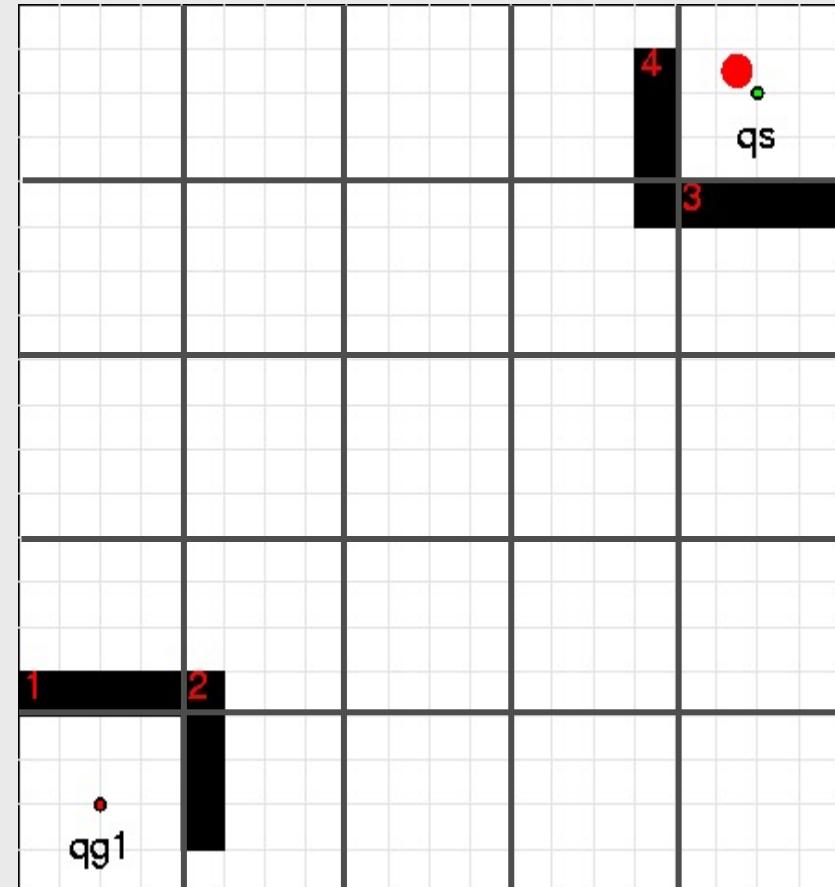
# Parallel A\*-Search: Idea

- ▶ C-space can easily be separated
- ▶ Search is done on more than one processor
- ▶ Speed up planning process



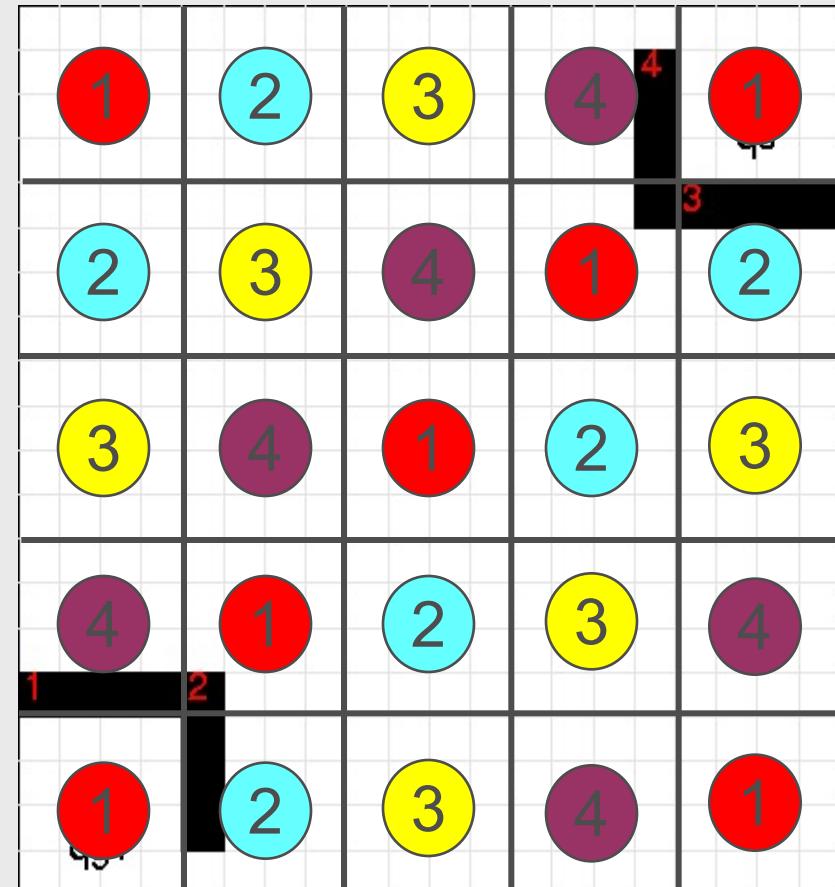
# Parallel A\*-Search

- ▶ Separation in hypercubes



# Parallel A\*-Search

- ▶ Separation in hypercubes
- ▶ cyclic distribution of processors



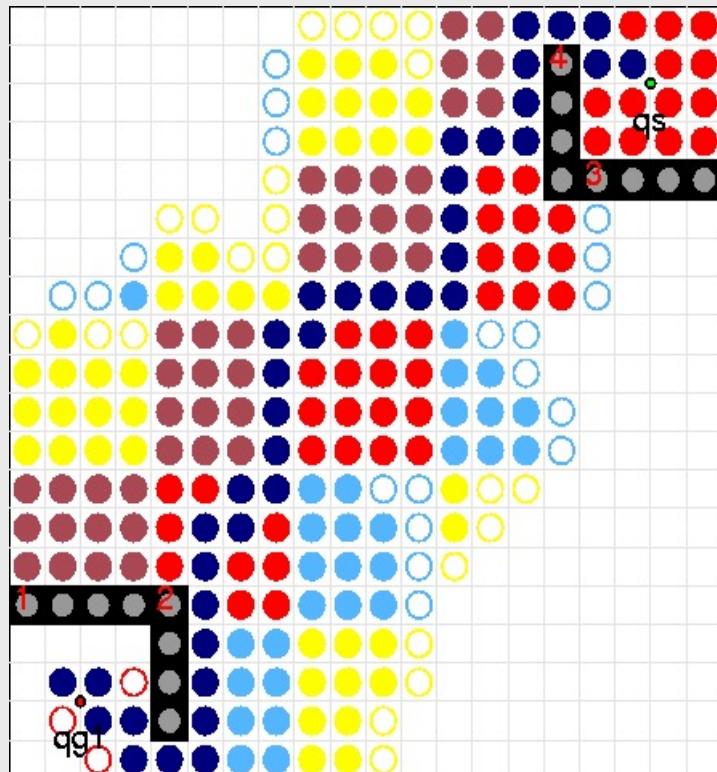
# Parallel A\*-Search

- ▶ Separation in hypercubes
- ▶ cyclic distribution of processors
- ▶ Local A\*-Search on every processor

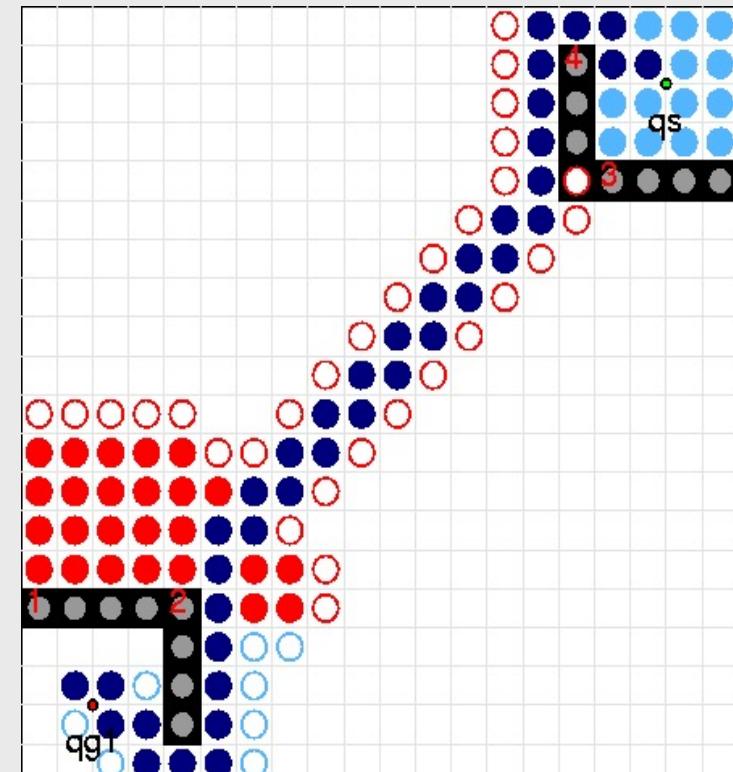


# Parallel A\*-Search: Size of hypercubes

- ▶ Solution is depending on size of hypercubes

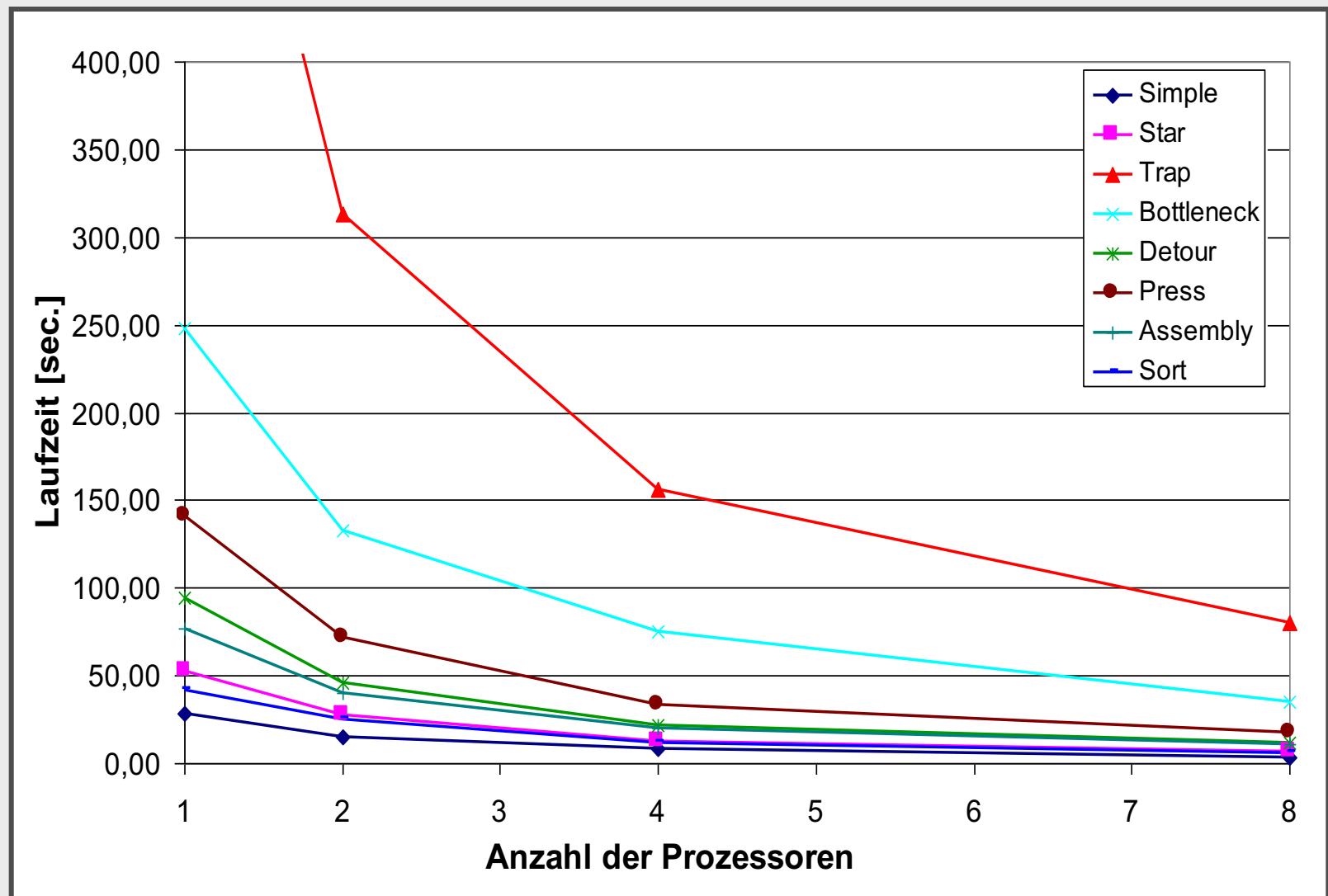


$b=4$



$b=16$

# Planning time with parallel A\*-Search



# Speedup

► Speedup  $S = T_{\text{serial}}/T_{\text{parallel}}$

