

# Lecture 11

## Planning - III - Configuration Spaces



# Course Logistics

- **Quiz 9 was posted today and was due before the lecture.**
- Project 2 is posted on 10/02 and will be due 10/11 (**today**).
- Project 3 will be posted today 10/11 and will be due 10/25.
  - Start early!



# Configuration Spaces

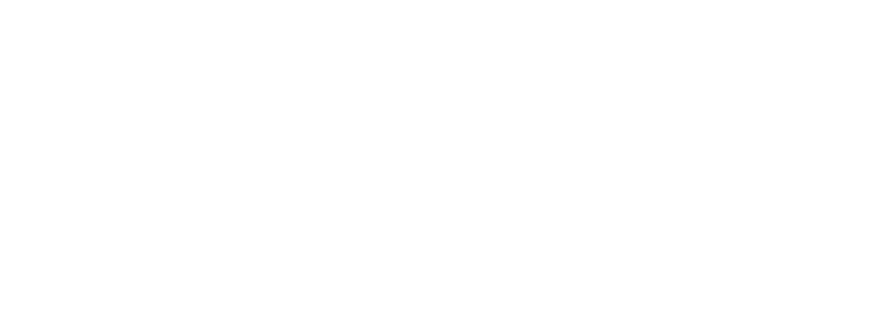


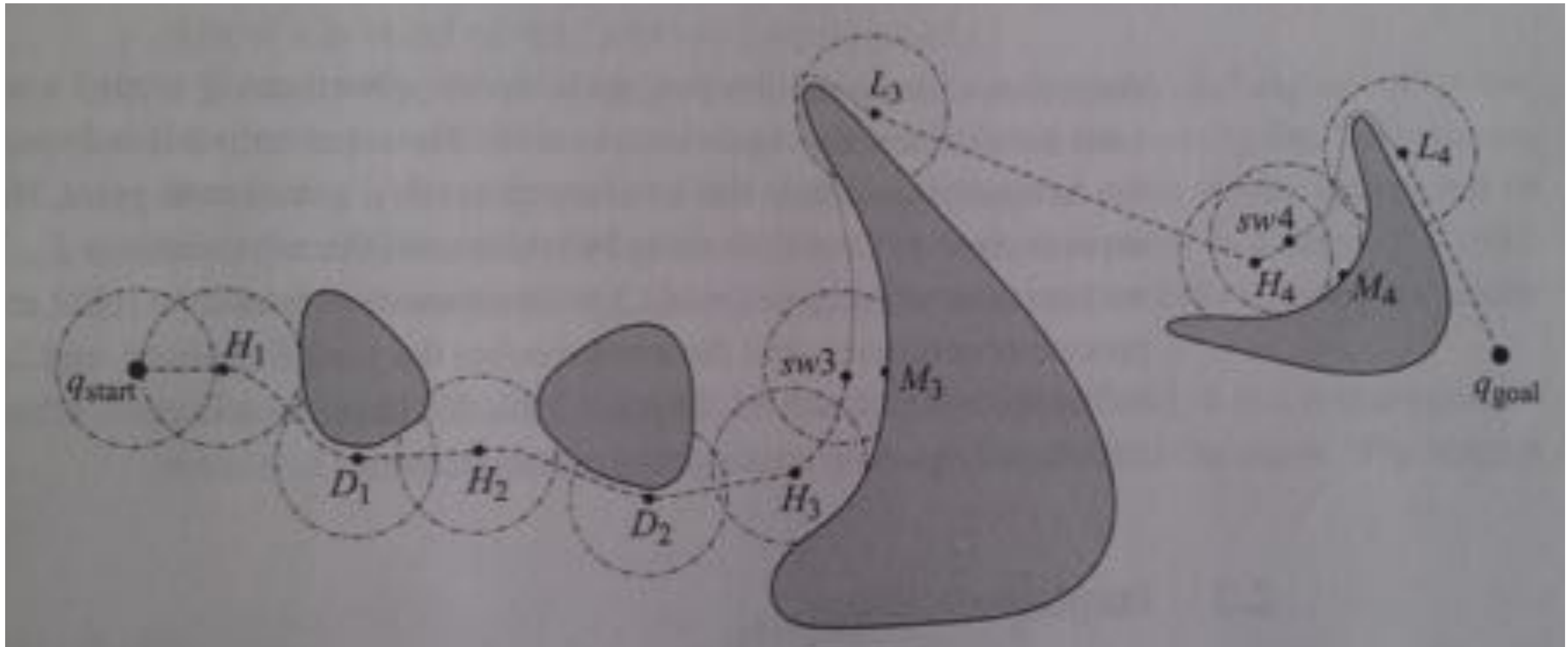
Figure 1.1



more than meets the eye



# Last time: Tangent Bug



What does BugX assume that Random Walk does not?



What does BugX assume that Random Walk does not?

Localization: knowing the robot's location, at least wrt. distance to goal



What does BugX assume that Random Walk does not?

Localization: knowing the robot's location, at least wrt. distance to goal

What do search algorithms assume that BugX does not?



What does BugX assume that Random Walk does not?

Localization: knowing the robot's location, at least wrt. distance to goal

What do search algorithms assume that BugX does not?

A graph of valid locations that can be traversed

Suppose we have or can build such a graph...





What does BugX assume that Random Walk does not?

Localization: knowing the robot's location, at least wrt. distance to goal

What do search algorithms assume that BugX does not?

A graph of valid locations that can be traversed

Suppose we have or can build such a graph...



# Approaches to motion planning

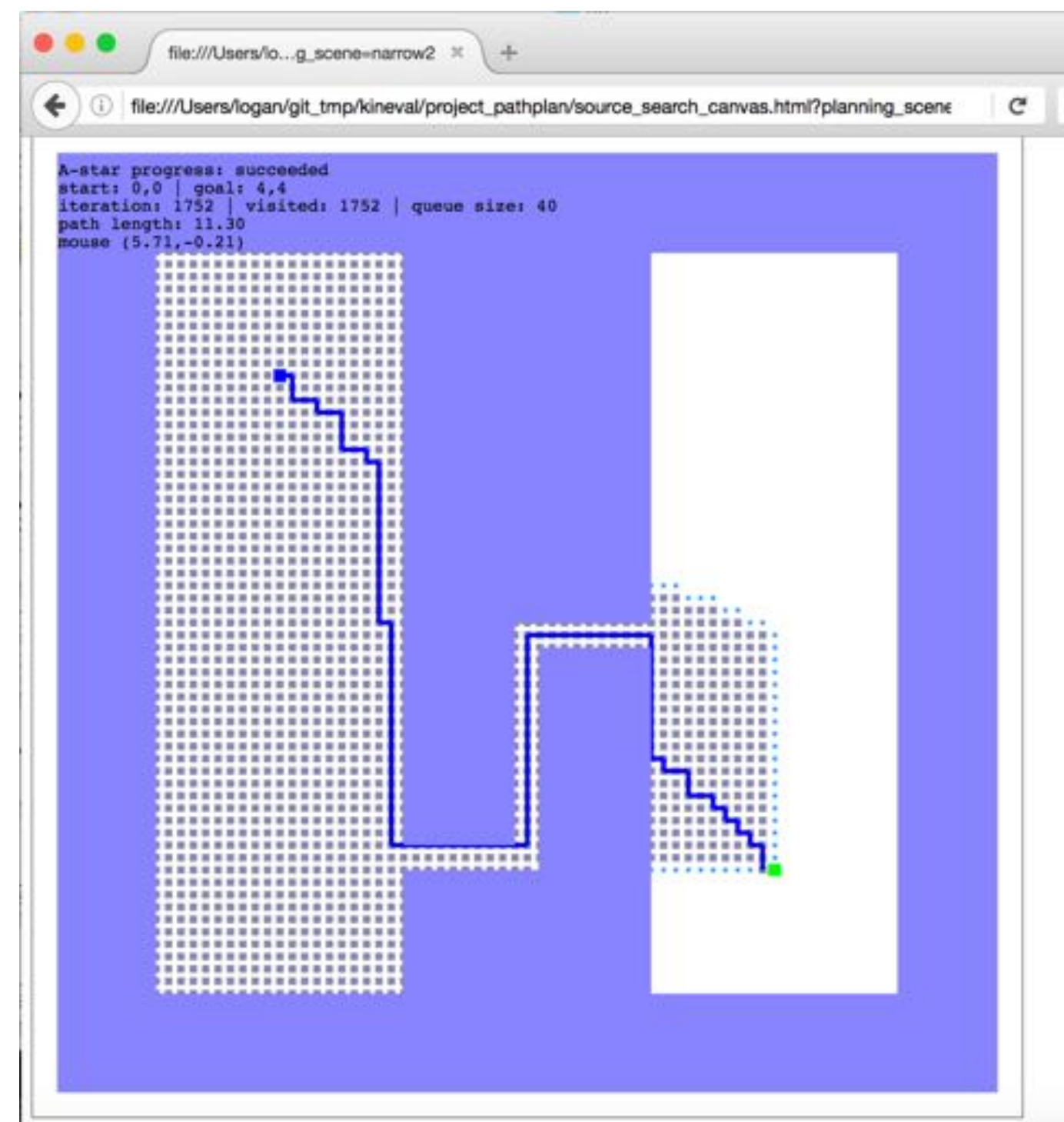
- Bug algorithms: Bug[0-2], Tangent Bug
- Graph Search (fixed graph)
  - Depth-first, Breadth-first, Dijkstra, A-star, Greedy best-first
- **Roadmap Search (build graph):**
  - **Probabilistic Road Maps, Rapidly-exploring Random Trees**
- Optimization (local search):
  - Gradient descent, potential fields, Wavefront



# Will our current search methods apply to this robot?

2D Path Planning

N-dimensional Motion Planning





# Will our current search methods apply to this robot?

## Assumptions:

- Known graph of traversability
  - How big is this graph? How was this graph built?
- Known localization and map/obstacles
  - How do we detect collisions?
  - Is our robot just a point in workspace?
- Known link geometry
  - Does robot geometry change wrt. configuration?





# Configuration Space

(or C-space)

- C-space ( $Q$ ) is the space of all possible configurations ( $q$ ) of a system
  - kinematics: geometry of possible configurations, without respect to physics
  - dynamics: evolution of configurations over time wrt. physics
- Each degree of freedom ( $q_i$ ) is a dimension of C-space
- The span of C-space is constrained by obstacles ( $QO_i$ ), joint limits, etc.

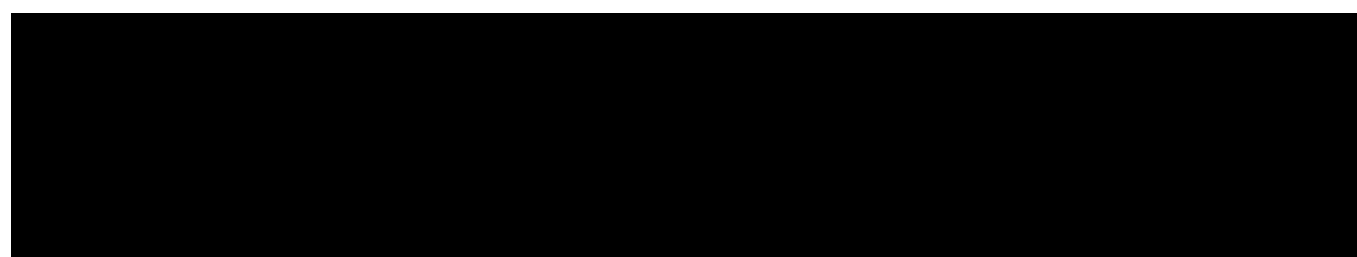


Consider some examples of  
configuration spaces



# Configuration Space

- Consider a robot  $d=21$  DOFs, where each DOF can take 1 of  $n=10$  angular values
- How many configurations?



# Configuration Space

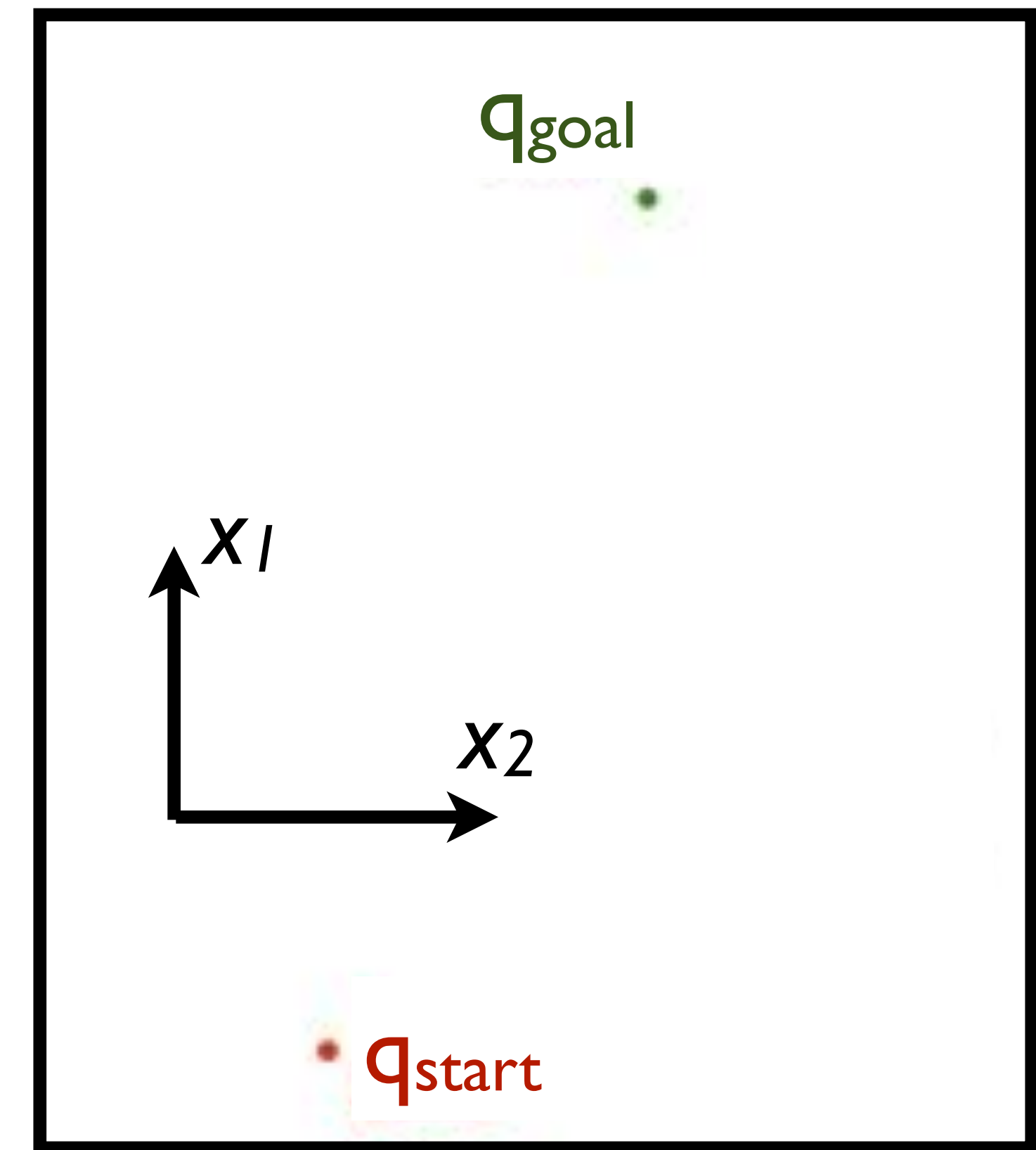
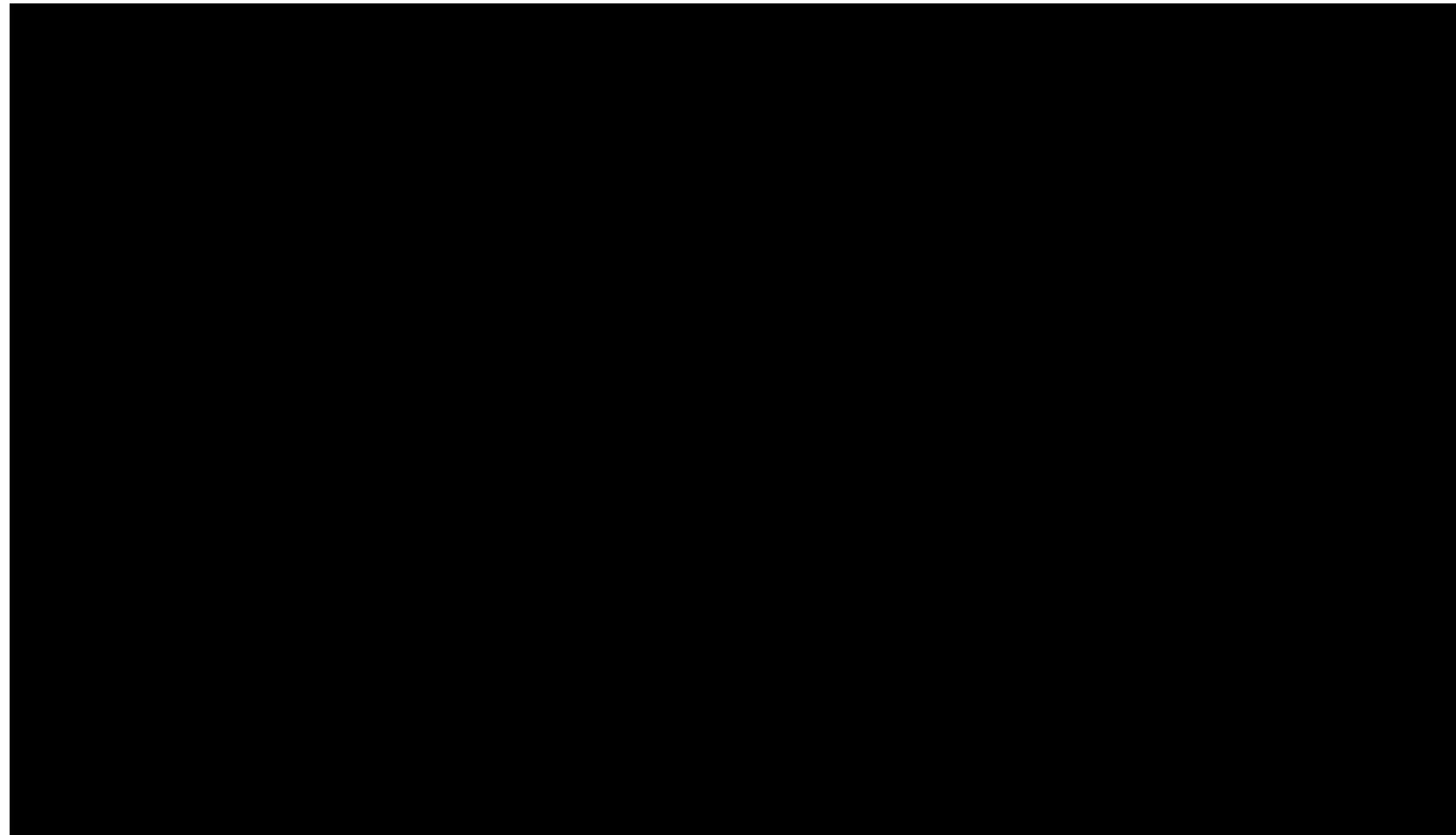
- Consider a robot  $d=21$  DOFs, where each DOF can take 1 of  $n=10$  angular values
- How many configurations?
  - $10^{21}$ ,  $n^d$  in general
- **“Curse of dimensionality”**
  - exponential growth of C-space wrt. number of DOFs
- Obstacles also create discontinuities and nonlinearities in C-space





# C-space examples

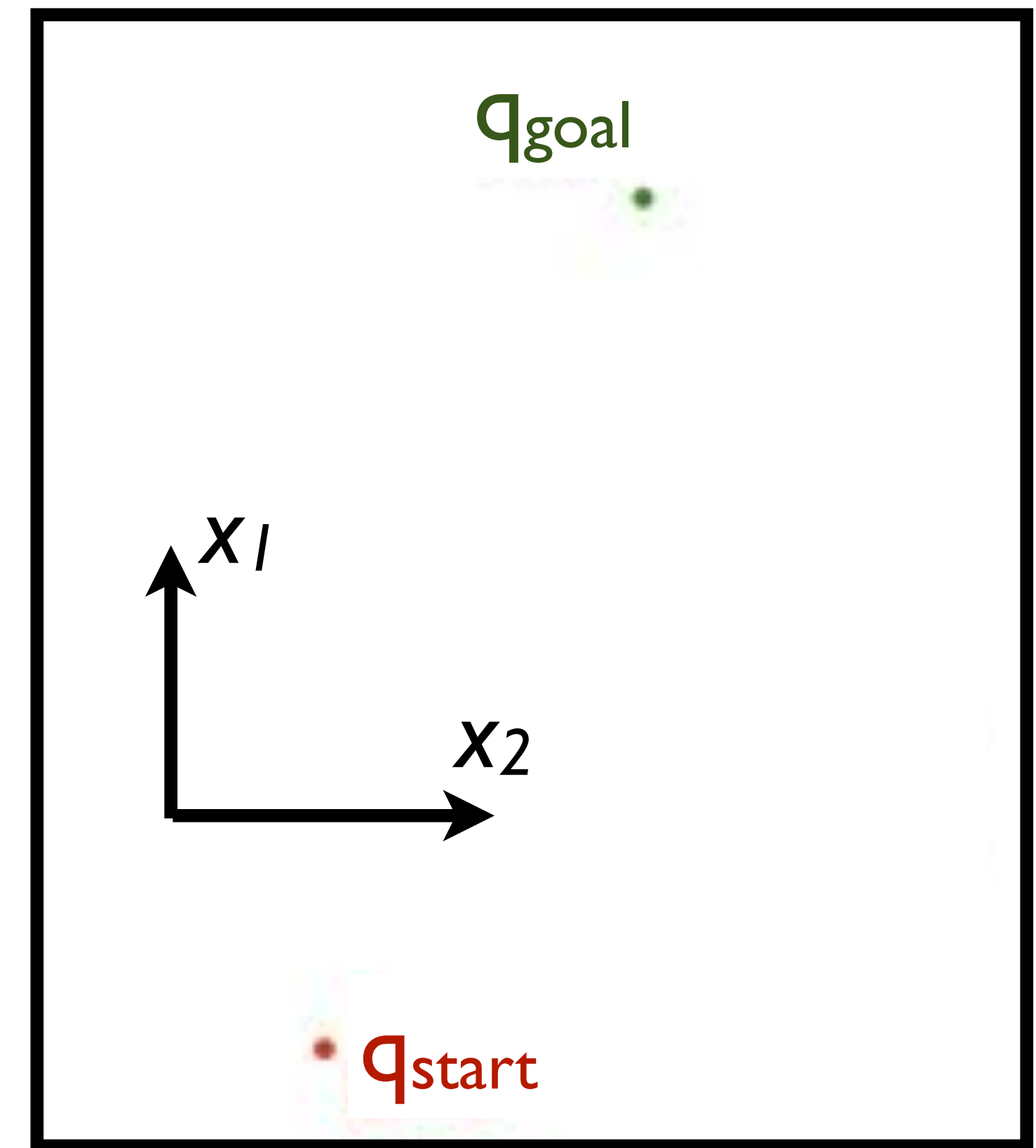
- How many configurations are in the C-space of a planar point robot in a bounded rectangular world?



# C-space examples

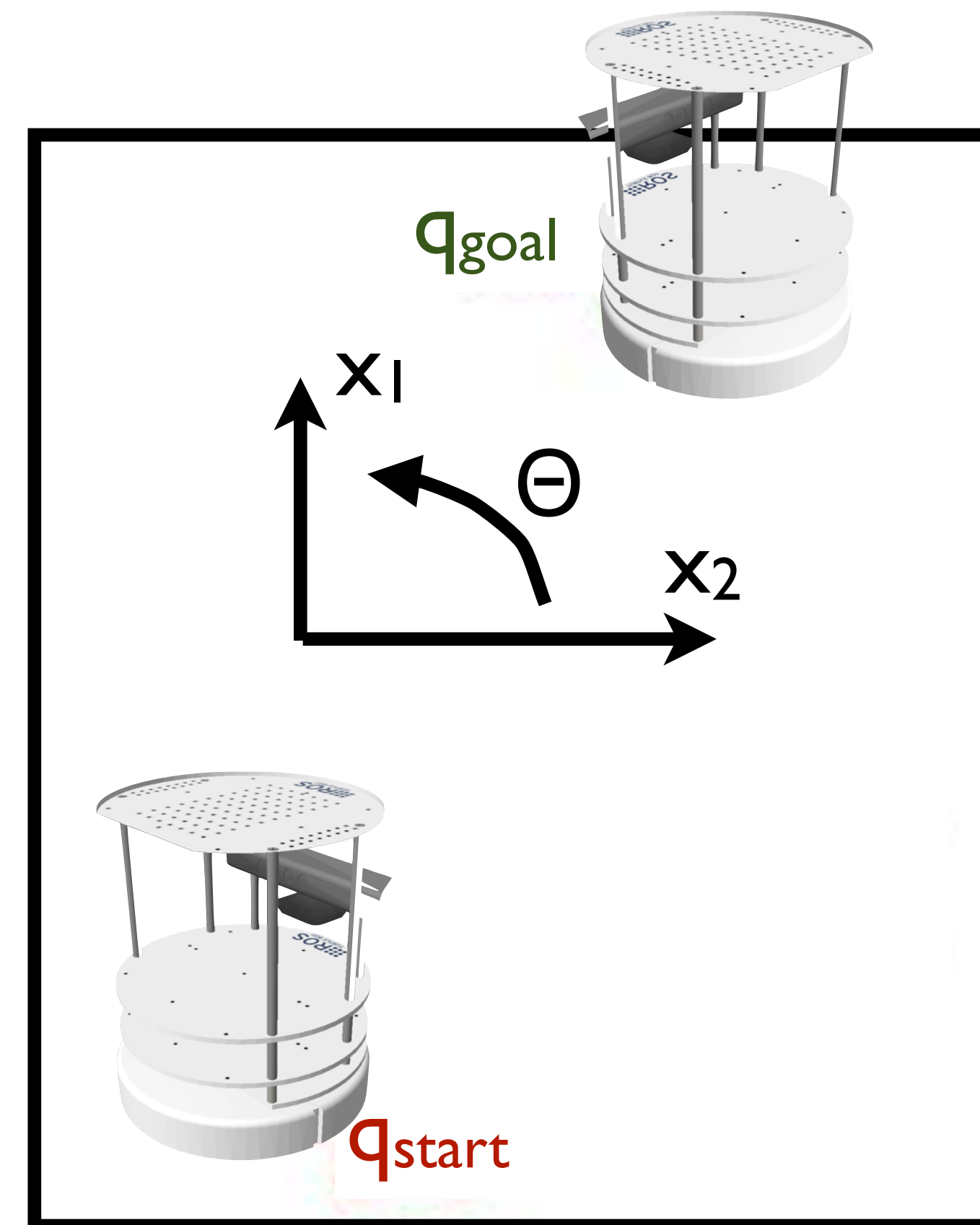
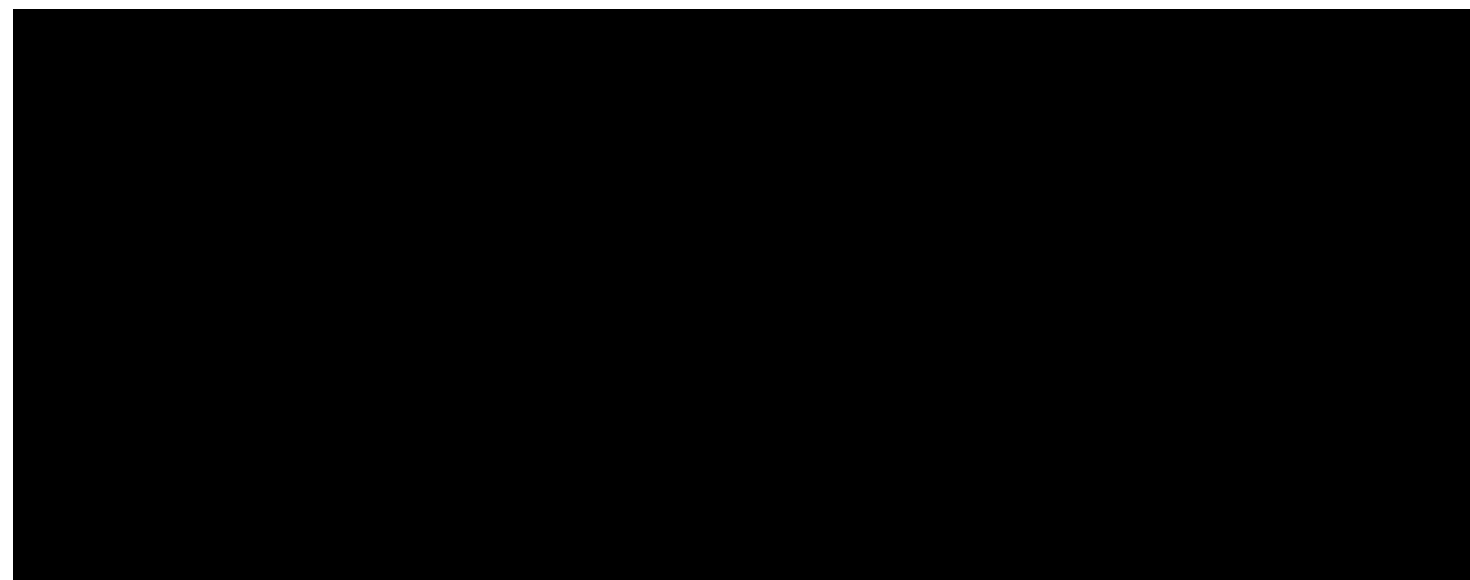
- How many configurations are in the C-space of a planar point robot in a bounded rectangular world?
  - DOFs: 2,  $\{x_1, x_2\}$
  - Number of poses is infinite
  - C-space:  $\mathbb{R}^2$

Topologically, this C-space is a homeomorphism of  $\mathbb{R}^2$



# C-space examples

- What is the C-space of a Turtlebot?



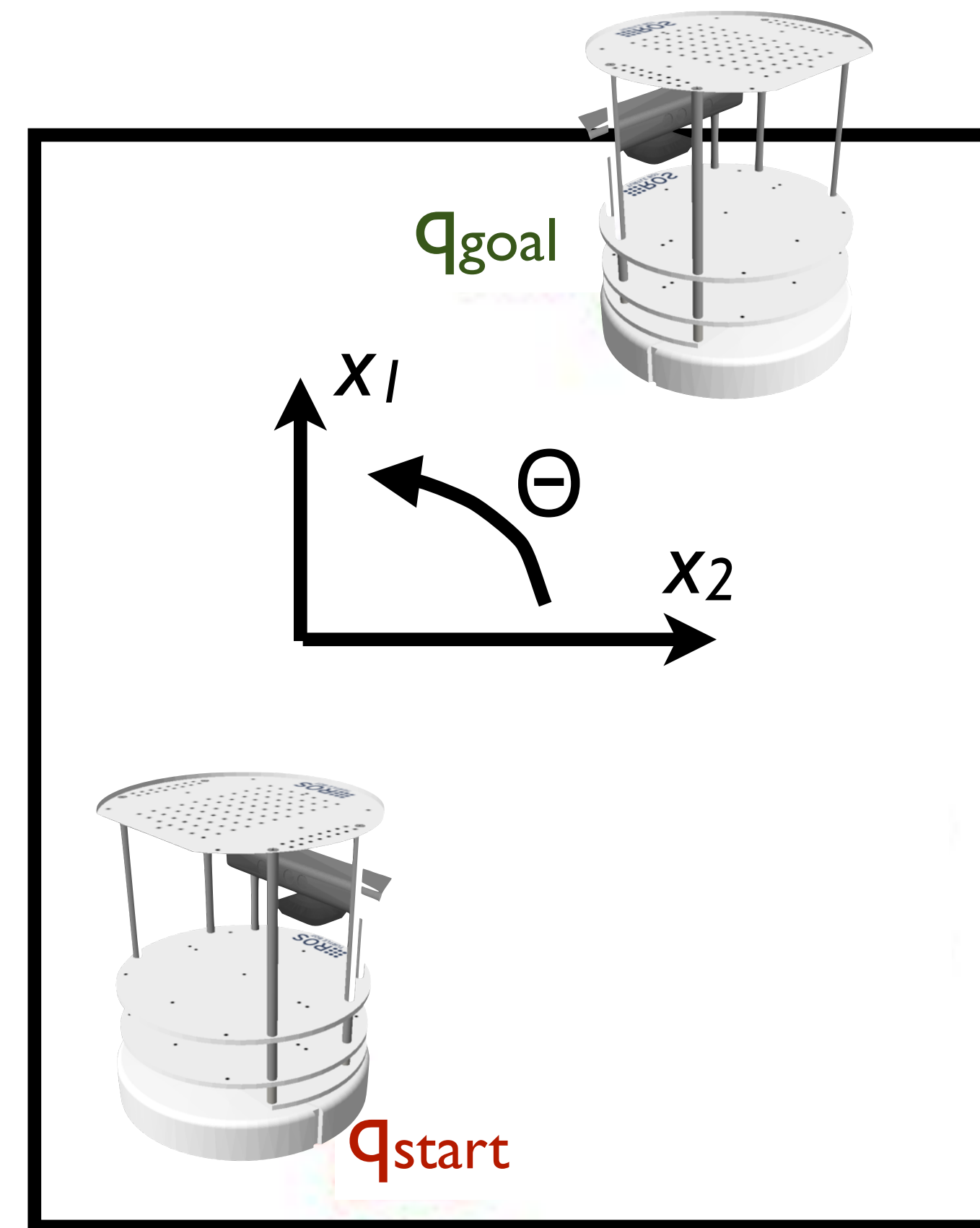
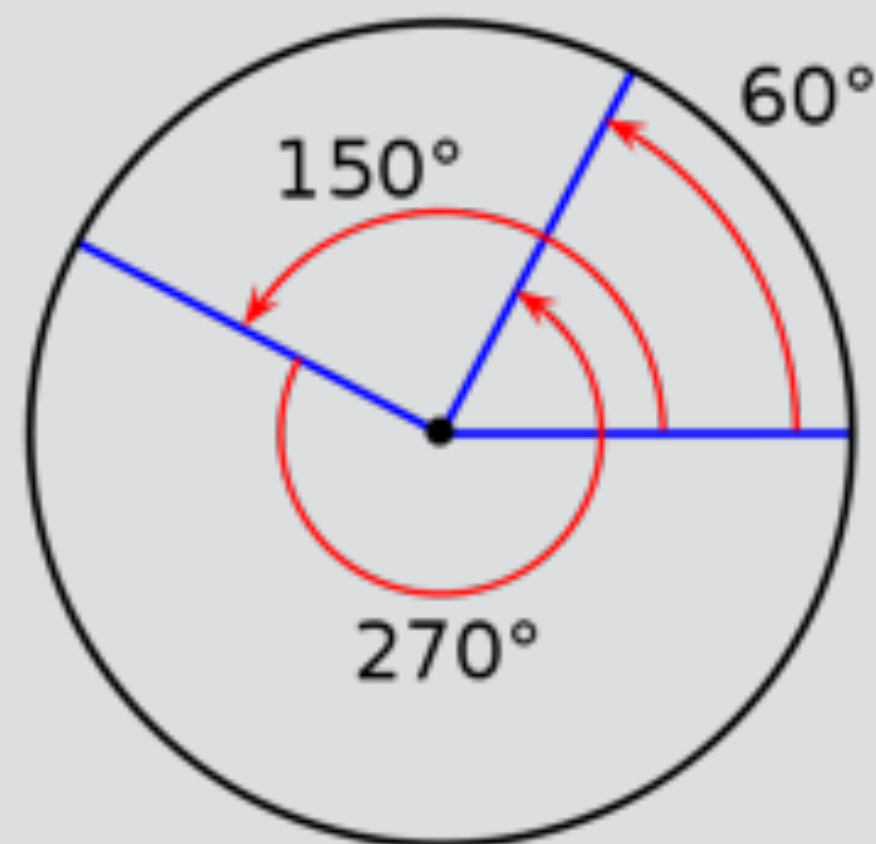
# C-space examples

- What is the C-space of a Turtlebot?
  - DOFs: 3,  $\{x_1, x_2, \Theta\}$
  - C-space:  $\mathbb{R}^2 \times S^1$

$S^1$  is the 1-sphere  
group of 1D rotations

$S^n$  is the n-sphere

$$S^1 \times S^1 \neq S^2$$





# C-space examples

- What is the C-space of a Turtlebot?

- DOFs: 3,  $\{x_1, x_2, \Theta\}$

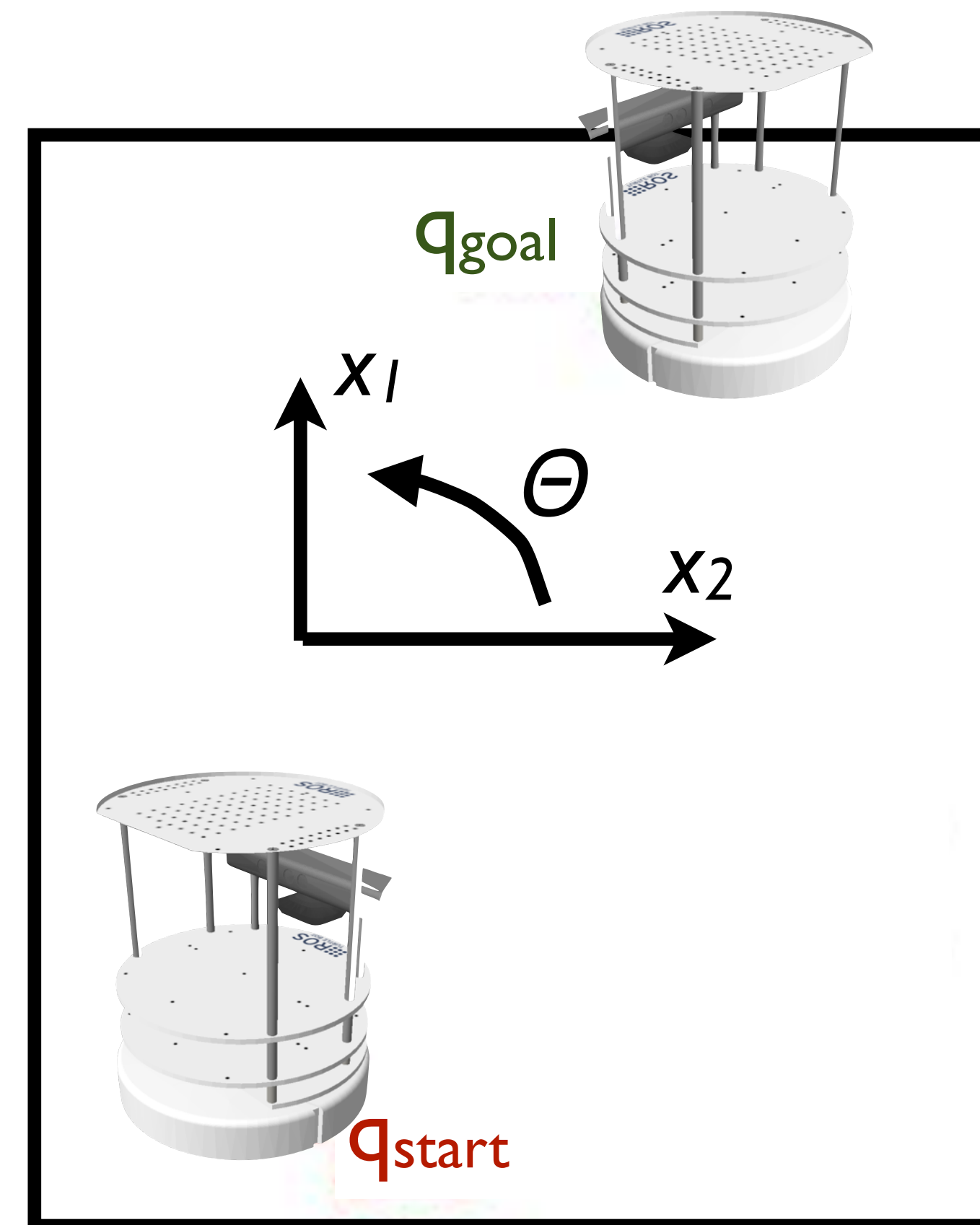
- C-space:  $\mathbb{R}^2 \times S^1$

2D translation

rotation in 2D

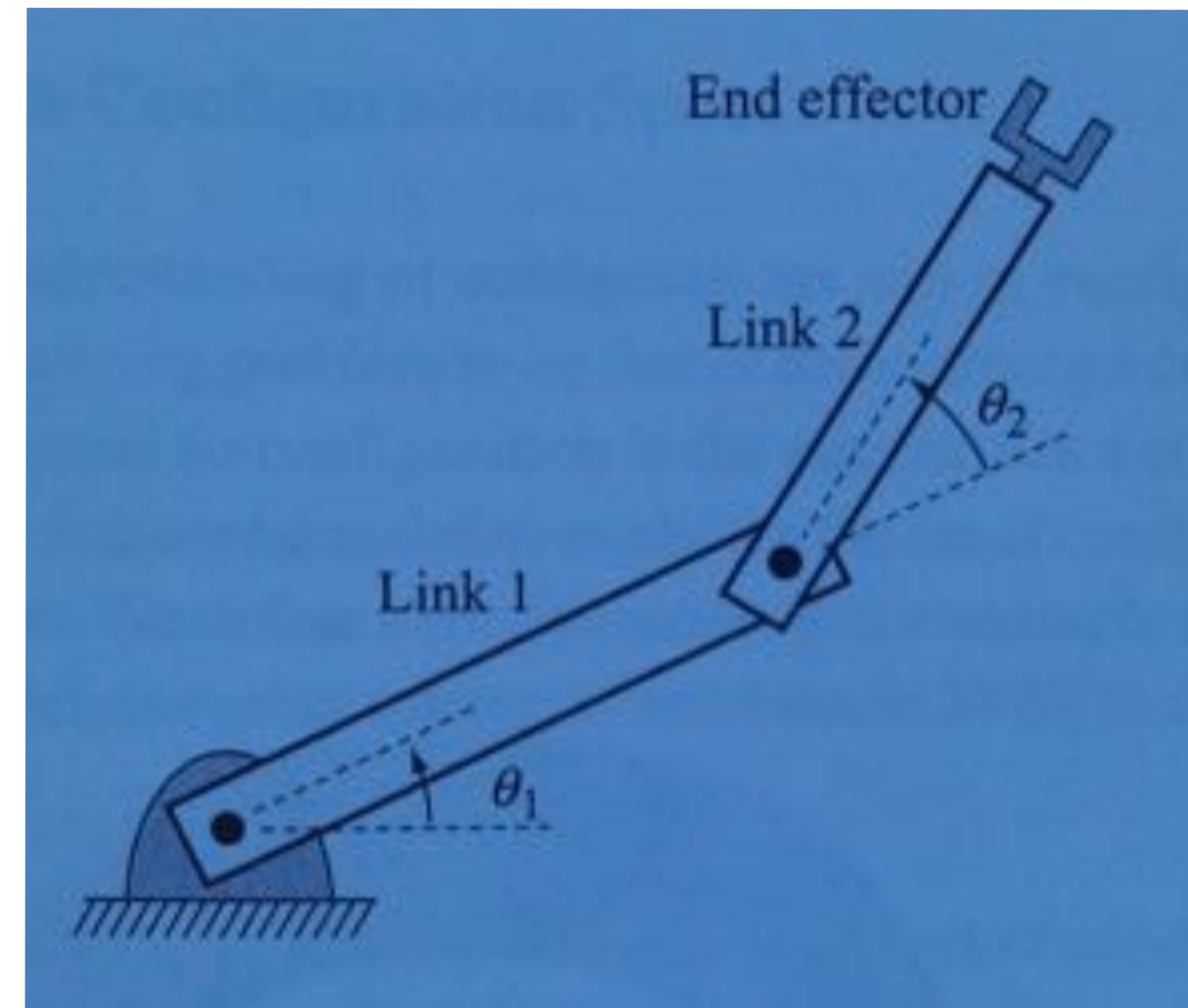
$\mathbb{R}^2 \times S^1$  is also known as the  $SE(2)$  group.

Group of homogeneous transformations in 2D



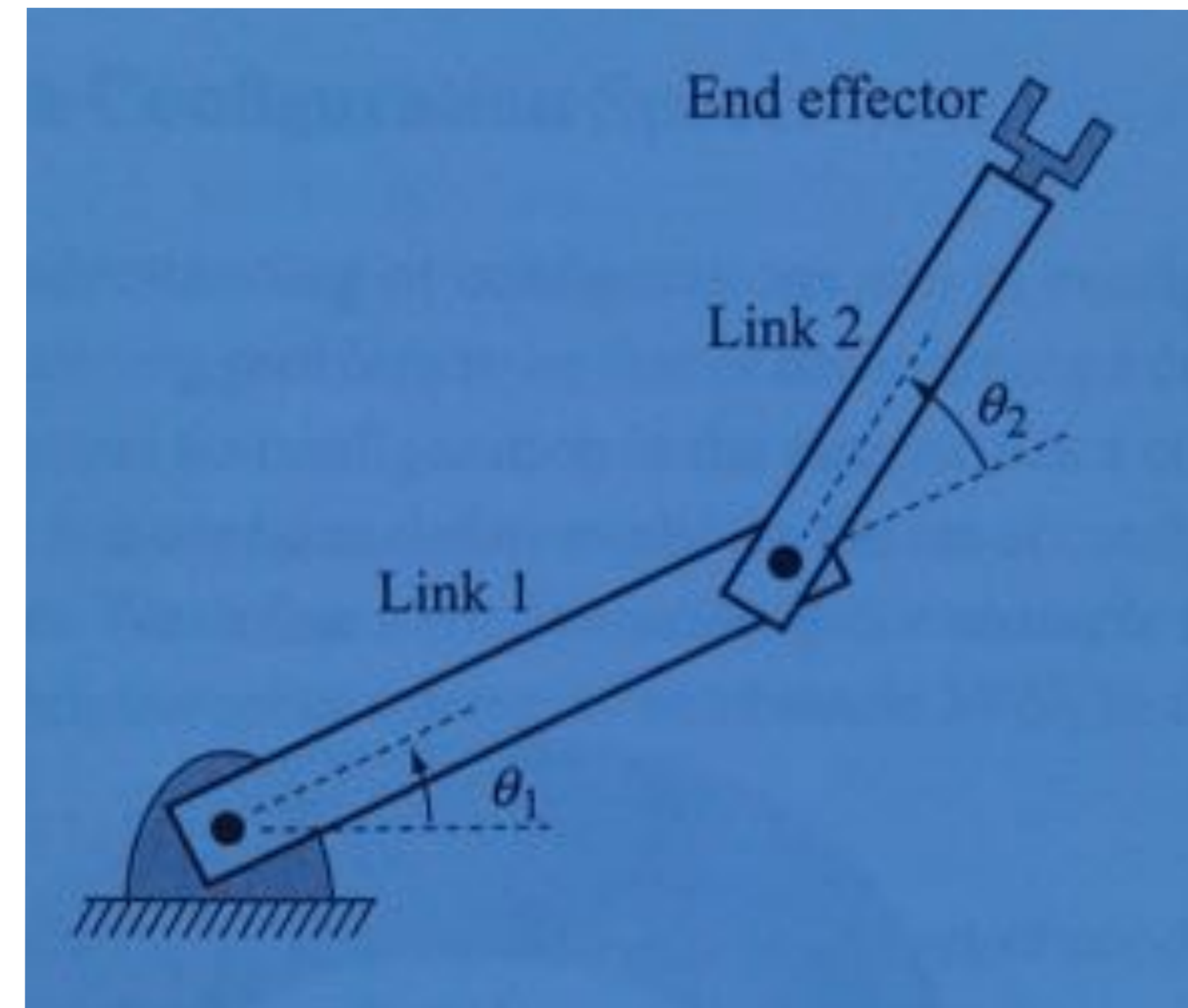
# C-space examples

- What is the C-space of a planar arm with 2 rotational joints?



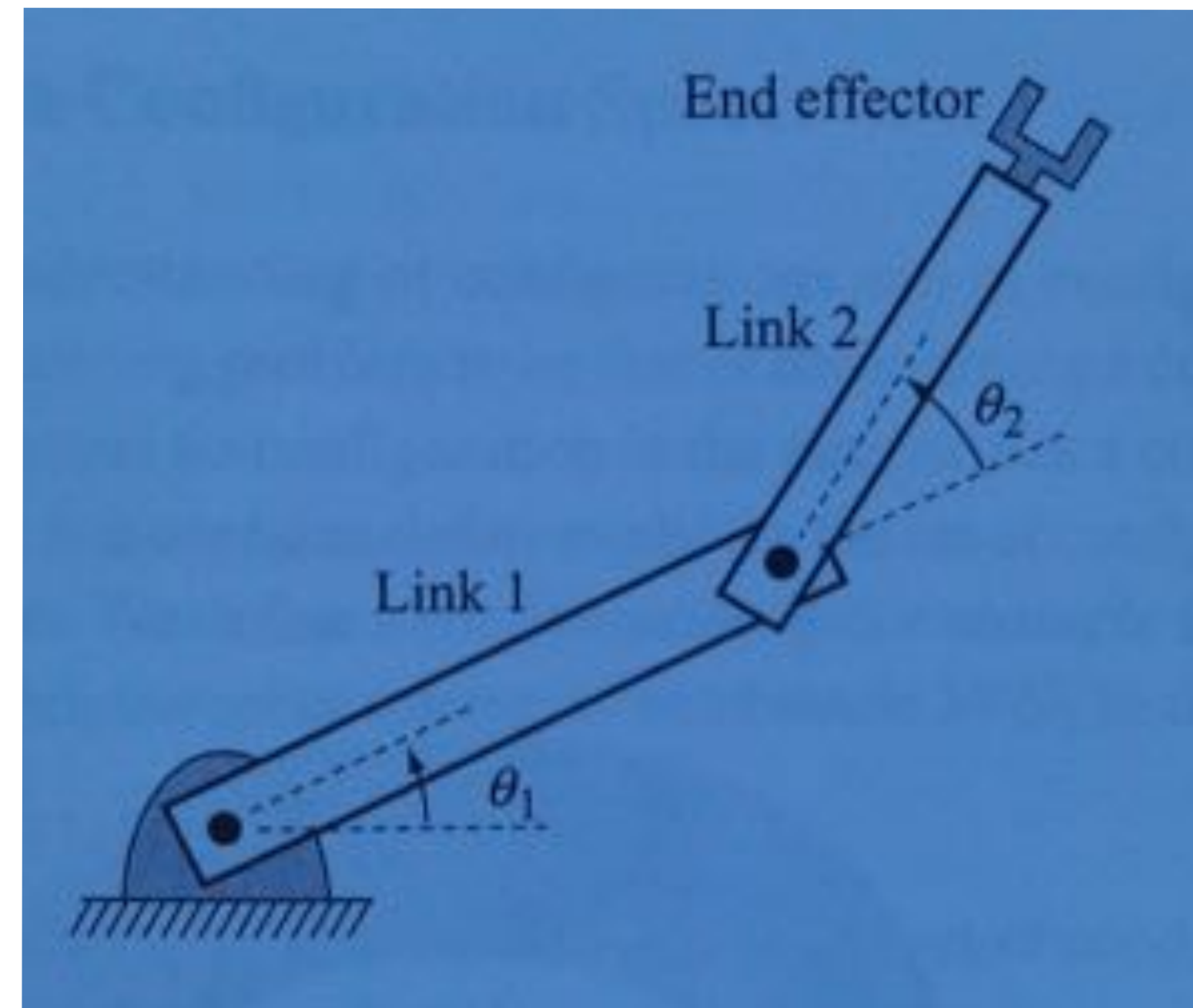
# C-space examples

- What is the C-space of a planar arm with 2 rotational joints?
  - DOFs: [REDACTED]
  - C-space: [REDACTED]



# C-space examples

- What is the C-space of a planar arm with 2 rotational joints?
  - DOFs: 2,  $\{\theta_1, \theta_2\}$
  - C-space:  $\mathbb{R}^2$  or  $S^2$  or  $S^1 \times S^1$  ?

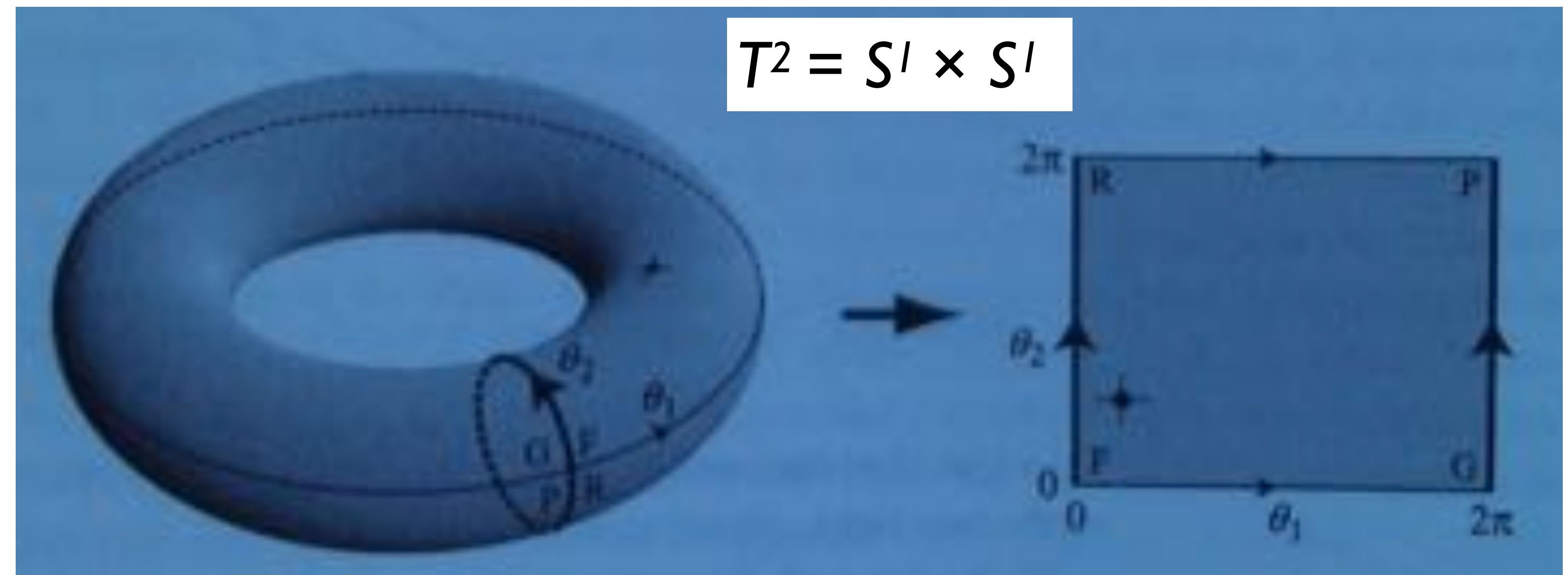
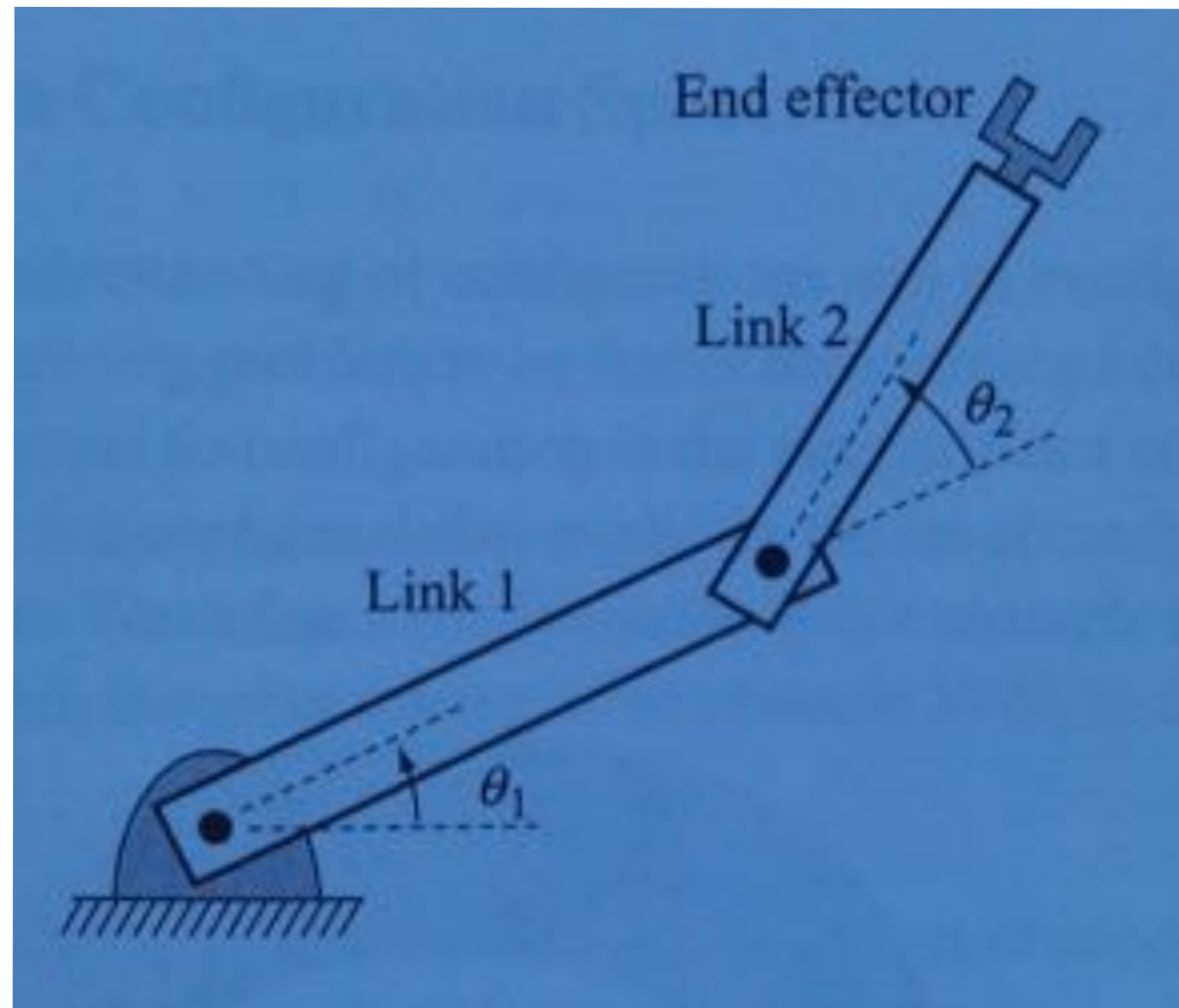


$S^1 \times S^1 = S^2$  when torus axis on surface



# T<sup>2</sup> Torus Group

Space must fuse on each DOF where  $2\pi = 0$



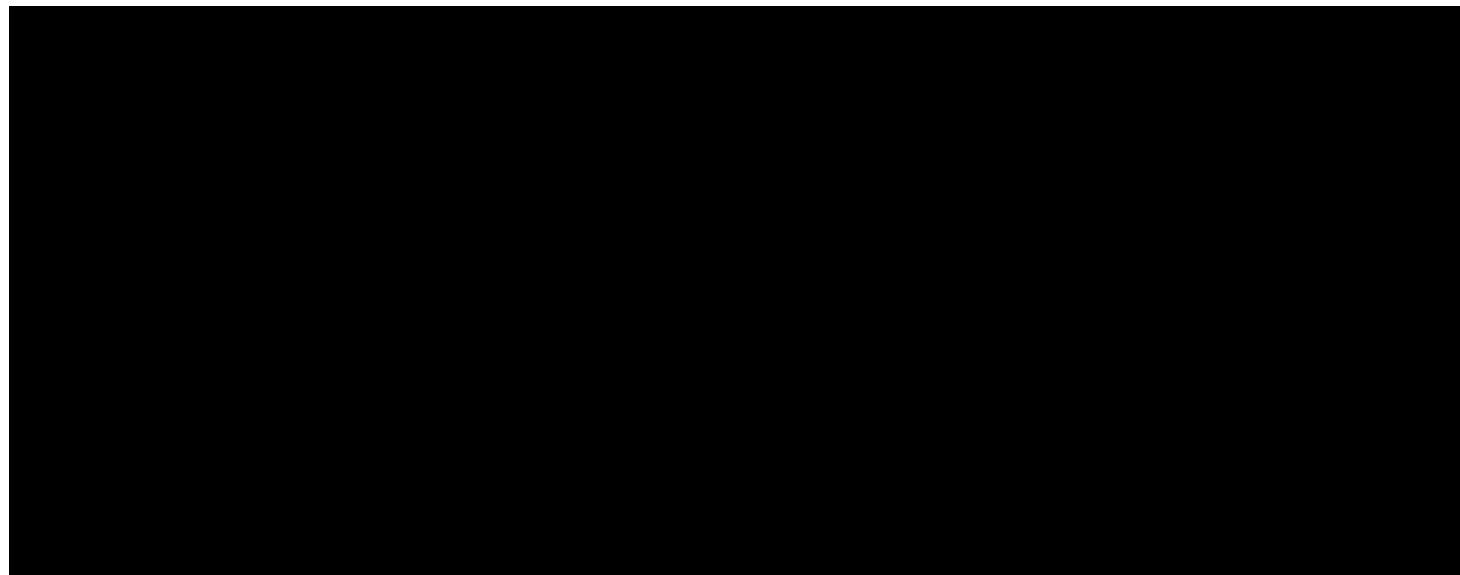
$$T^2 = S^1 \times S^1$$

$T^n$  is the torus group for an N-D rotational system

$$T^n = \underbrace{S^1 \times S^1 \times \dots \times S^1}_n$$

# C-space examples

- What is the C-space of a Barrett WAM arm with 4 rotational joints, not including fingers of gripper?



# C-space examples

- What is the C-space of a Barrett WAM arm with 4 rotational joints, not including fingers of gripper?
  - DOFs: 4
  - C-space:  $T^4$





# C-space examples

- What is the C-space of a quad rotor helicopter?



V. Kumar et al. (2010) - UPenn - <https://www.youtube.com/watch?v=MvRTALJp8DM>











# C-space examples

- What is the C-space of a quad rotor helicopter?

- DOFs: 6

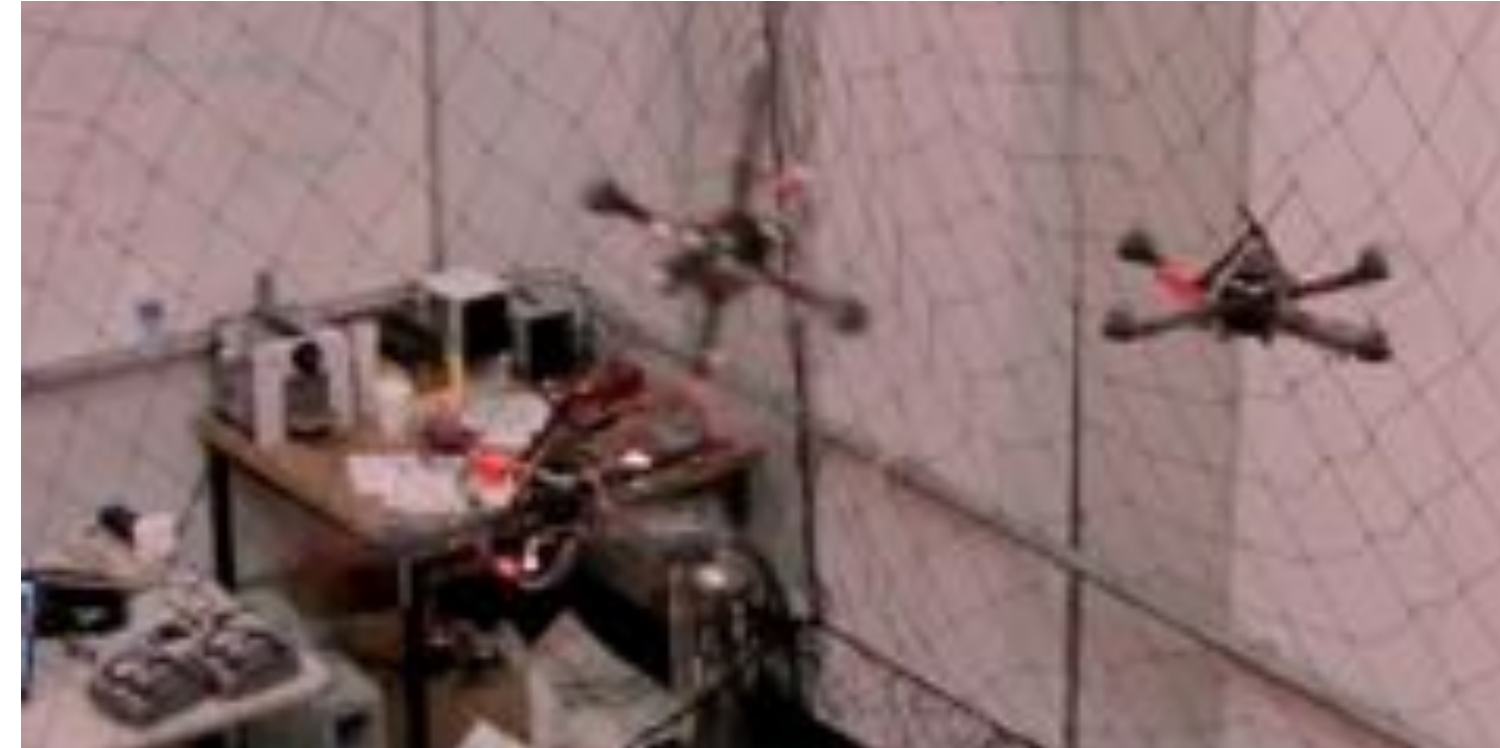
- C-space:  $SE(3)$ ,

- or  $\mathbb{R}^3 \times SO(3)$

3D translation

3D rotation

Group of homogeneous transformations in 3D



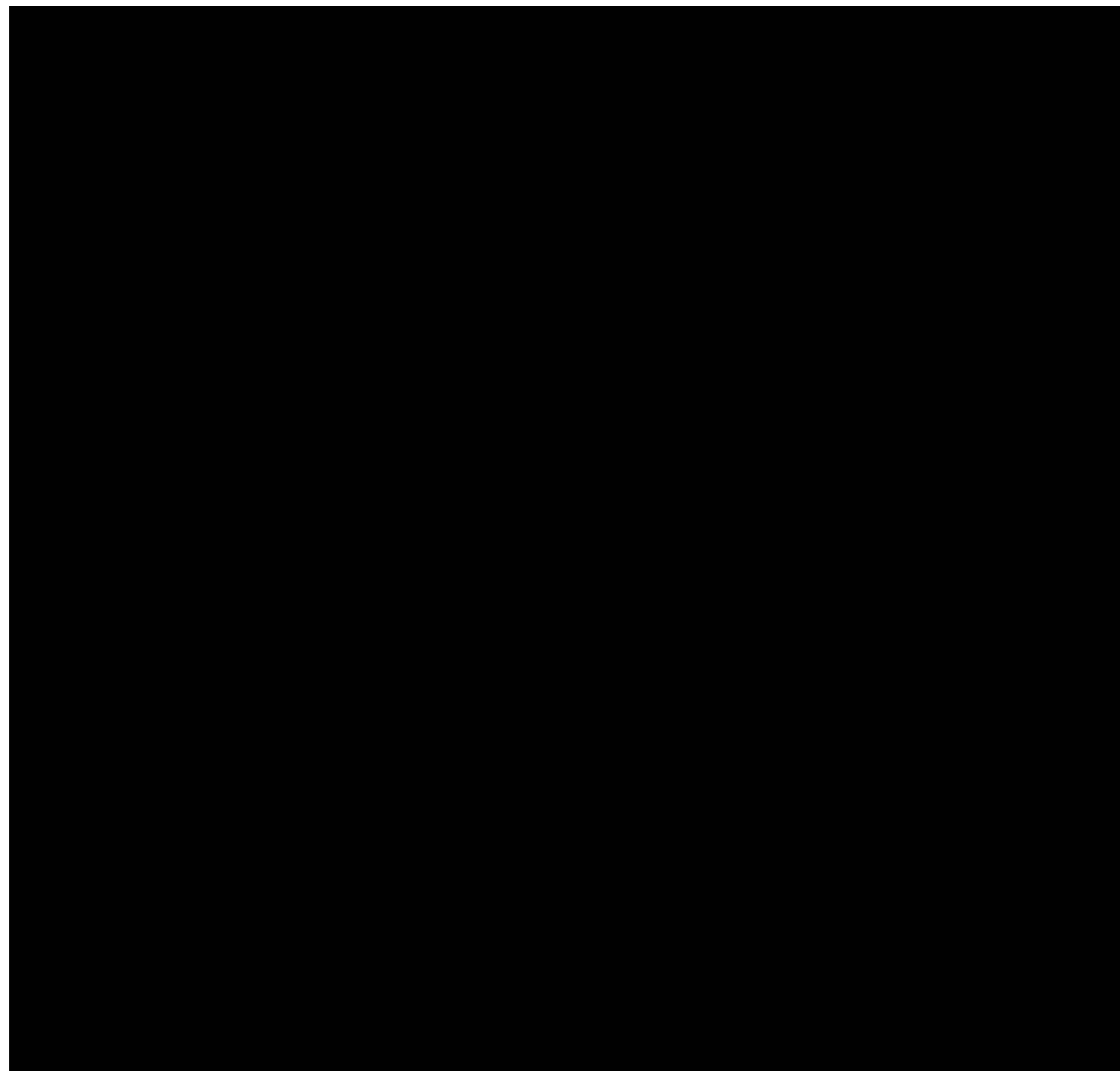
$SE(3)$  combines:  
 $\mathbb{R}^3$ : 3D translation and  
 $SO(3)$ : 3D rotation

$$SO(3) = S^I \times S^I \times S^I$$



# C-space examples

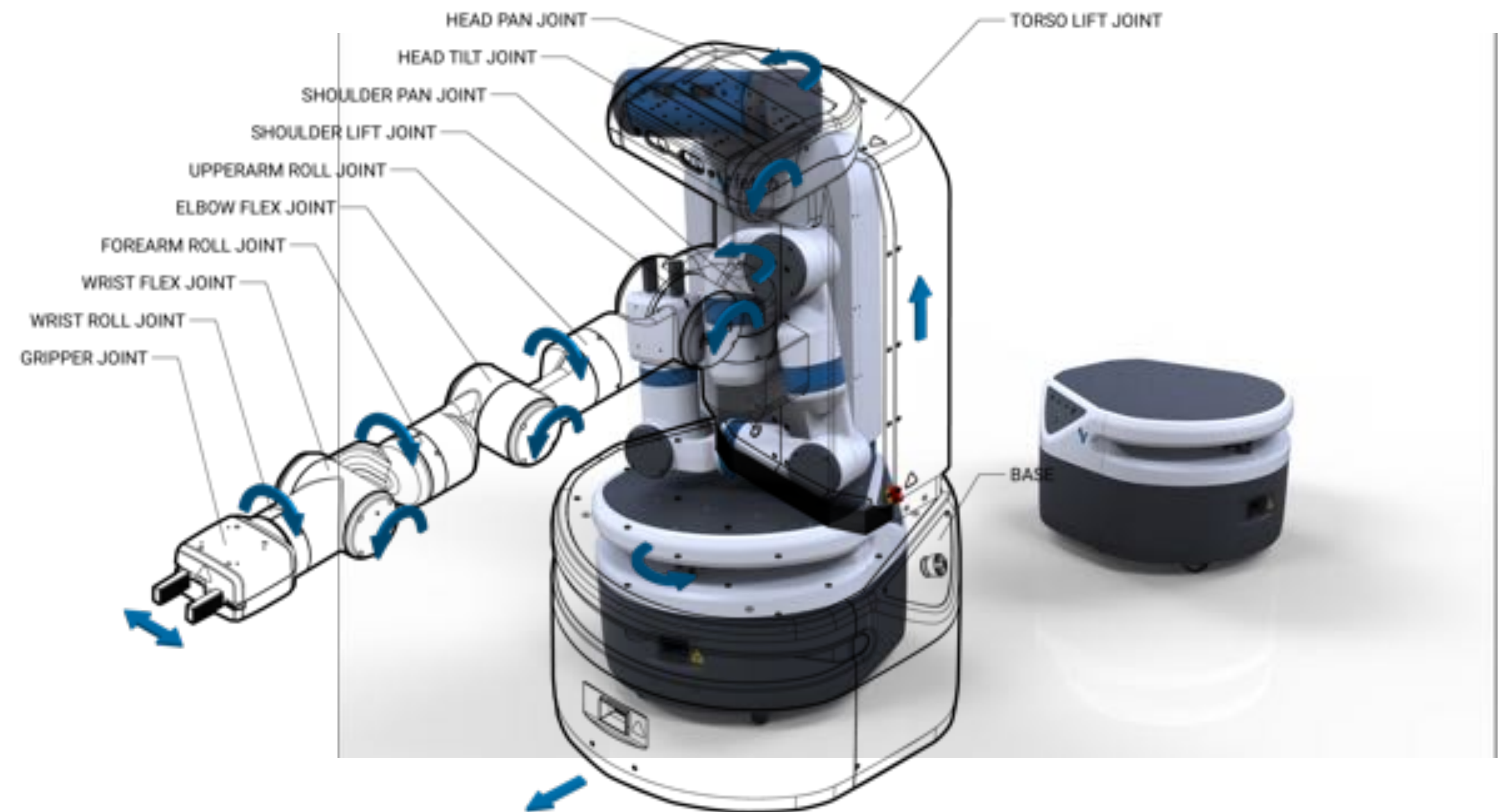
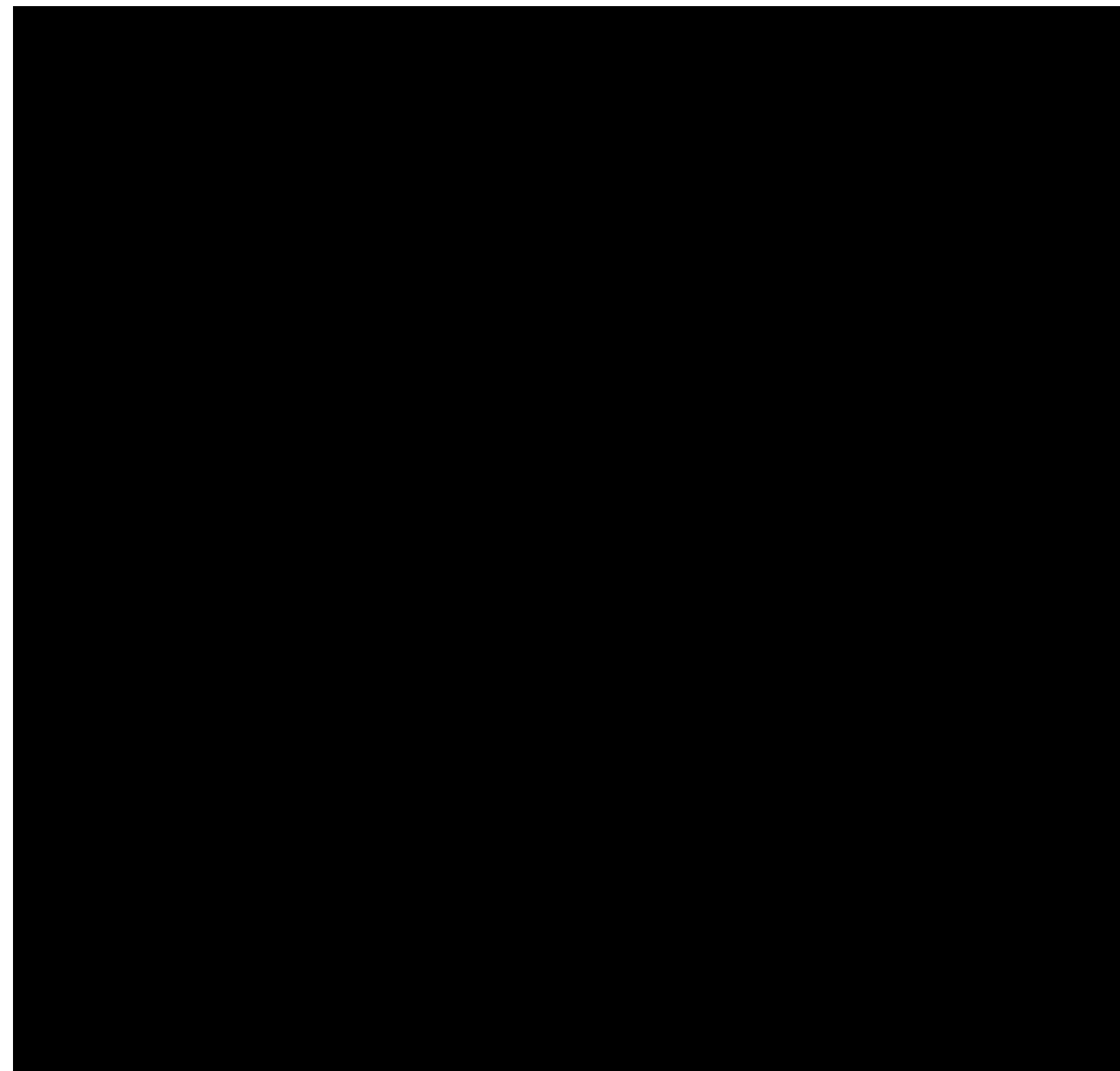
- What is the C-space of a Fetch robot, not including grippers?





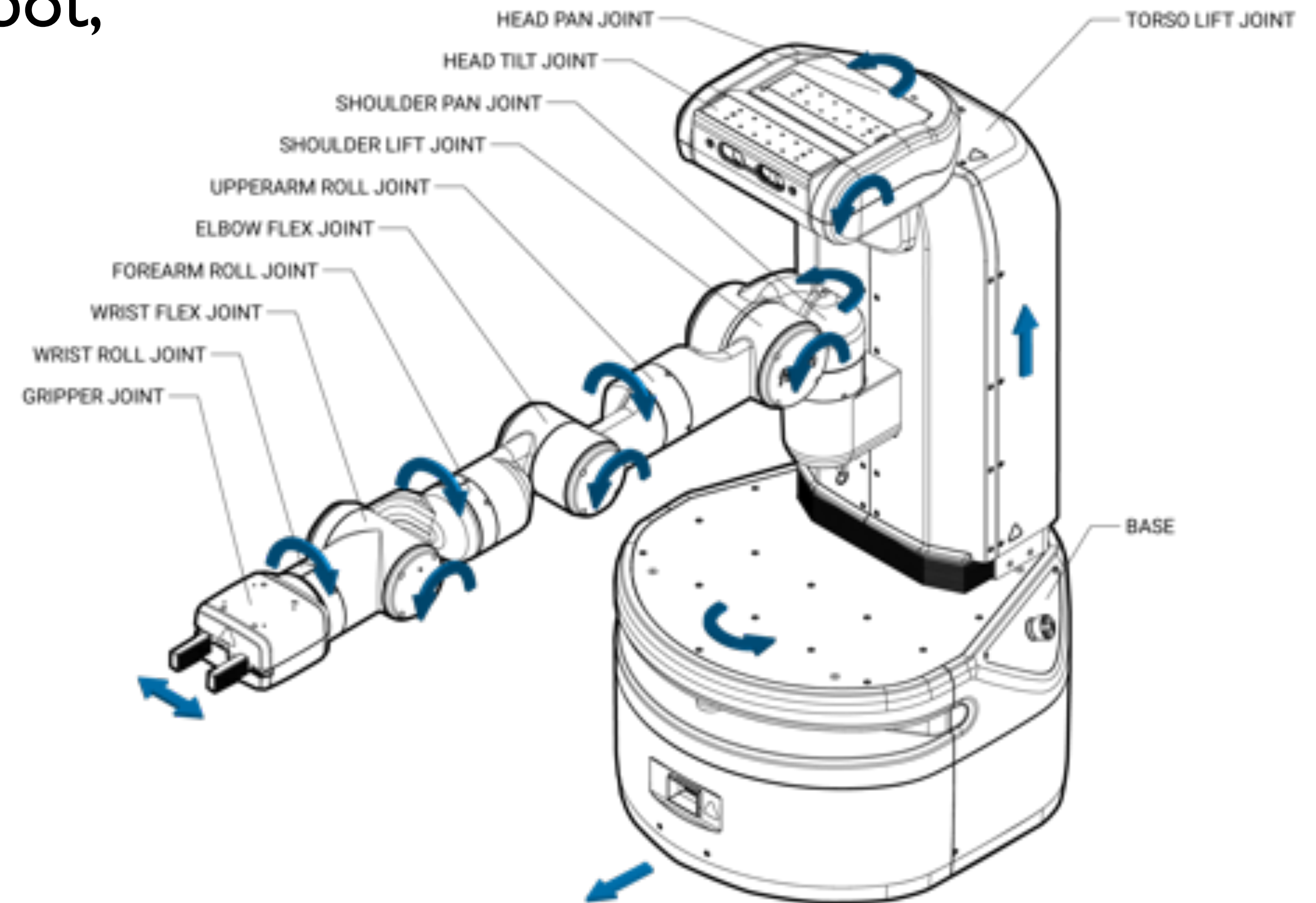
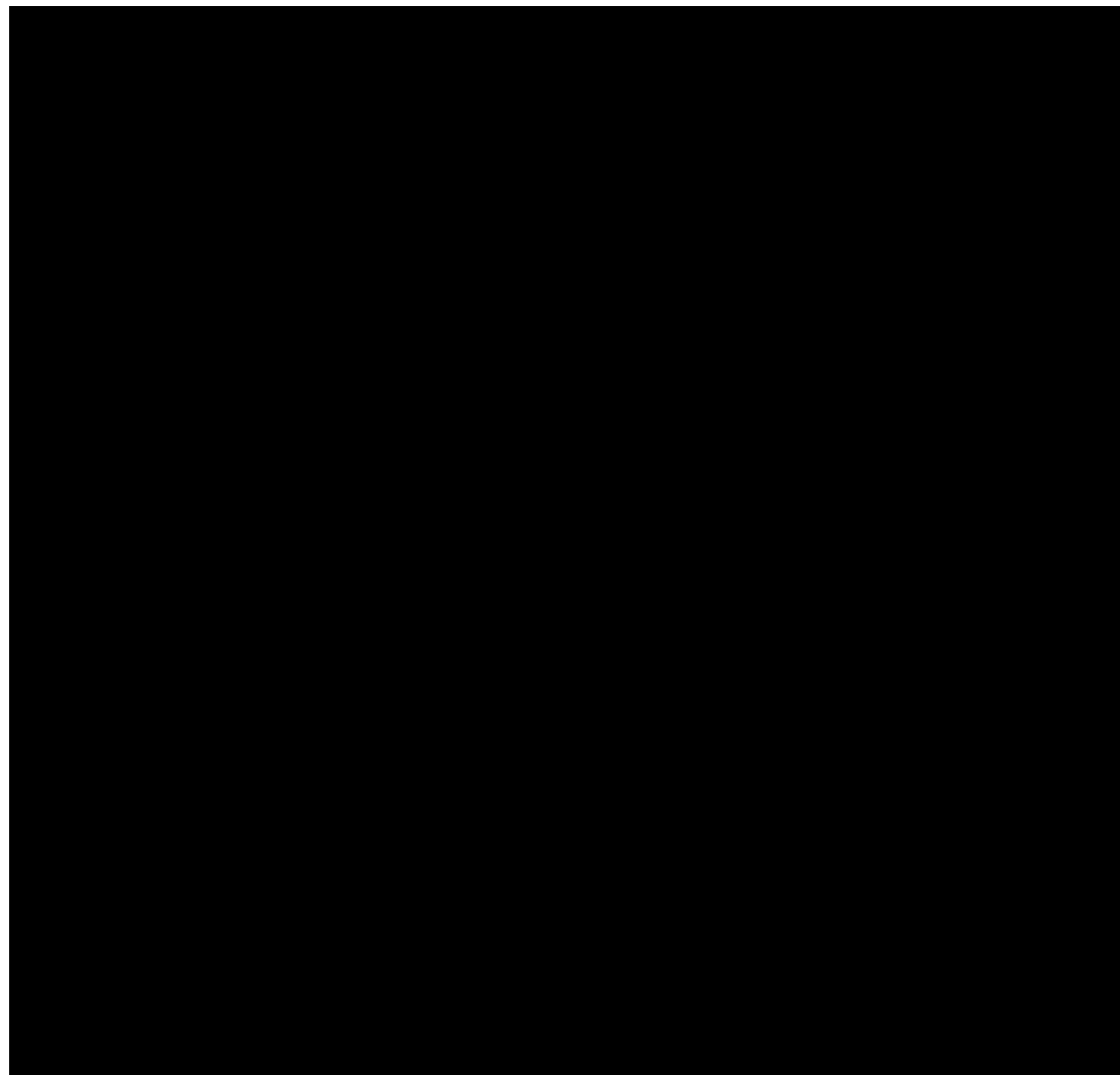
# C-space examples

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# C-space examples

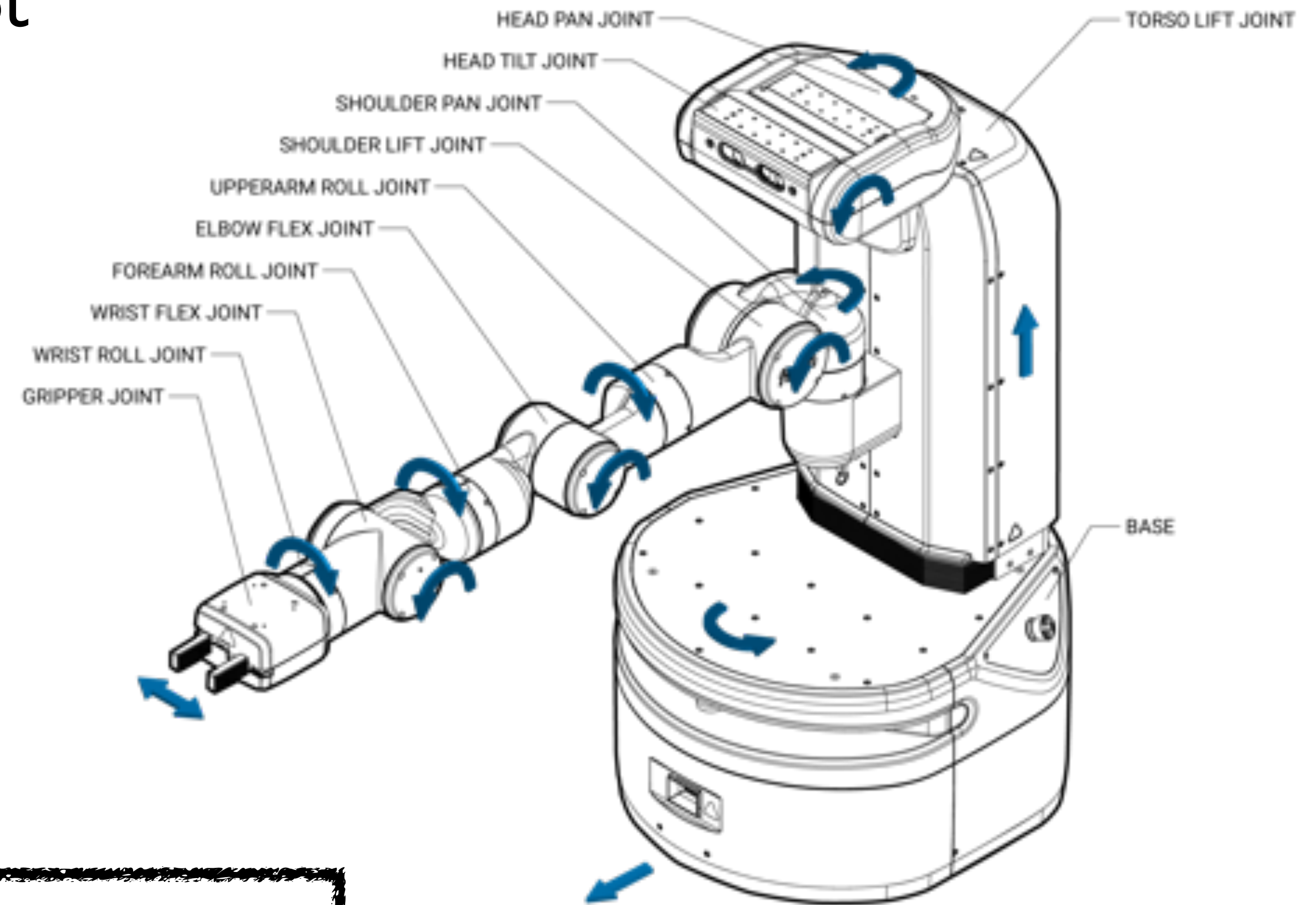
- What is the C-space of a Fetch robot, not including grippers?





# C-space examples

- What is the C-space of a Fetch, not including grippers?
- DOFs: 13
  - 3 in base:  $SE(2)$
  - 7 in arm:  $T^7$
  - 1 in the spine:  $\mathbb{R}^1$
  - 2 in neck:  $T^2$

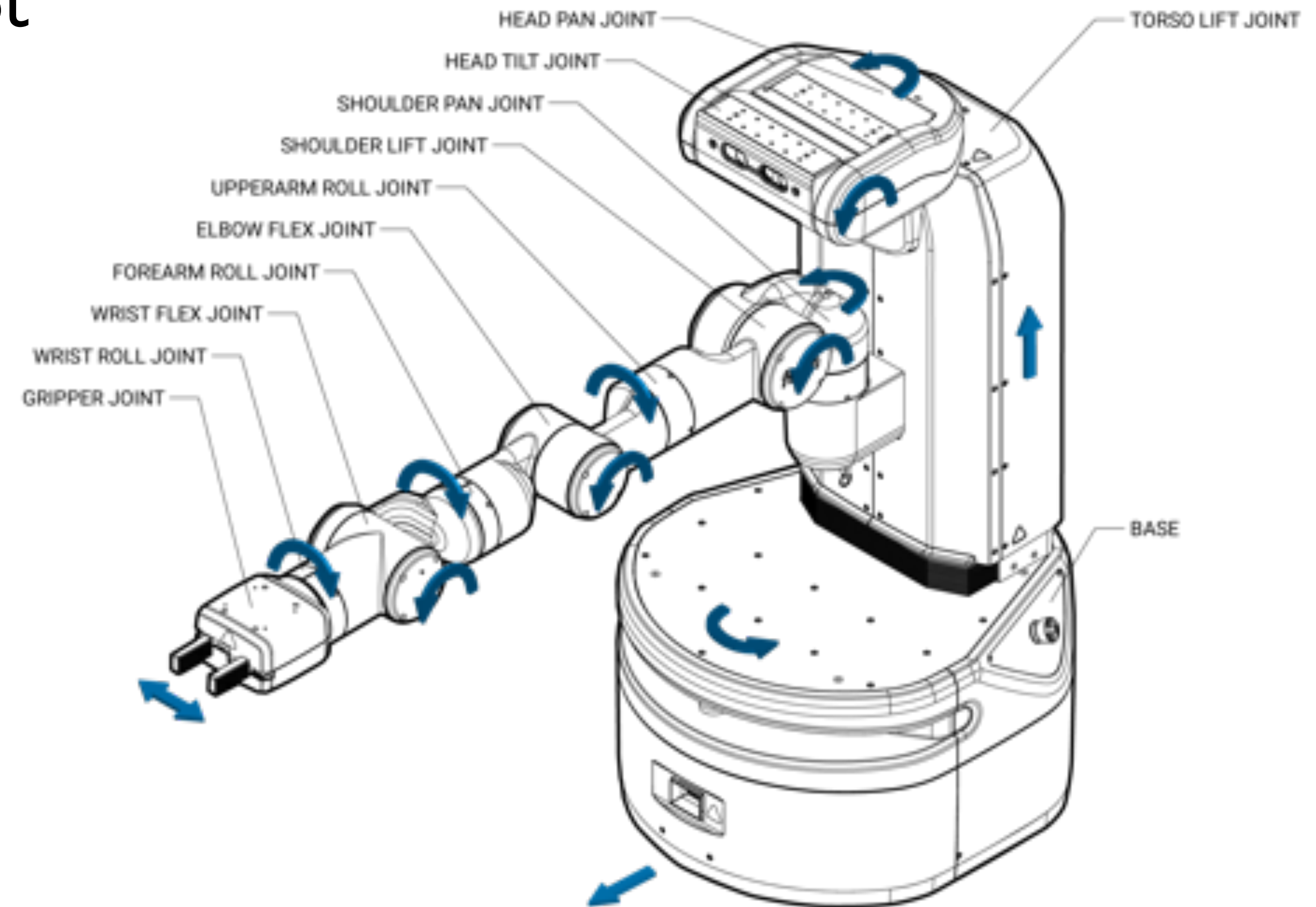


$$\text{C-space: } SE(2) \times T^7 \times \mathbb{R}^1 \times T^2$$

# Did we get this wrong?

- What is the C-space of a Fetch, not including grippers?
- DOFs: 13
  - 3 in base:  $SE(2)$
  - 7 in arm:  ~~$T^7$~~
  - 1 in the spine:  $\mathbb{R}^1$
  - 2 in neck:  ~~$T^2$~~

Consider  
joint limits



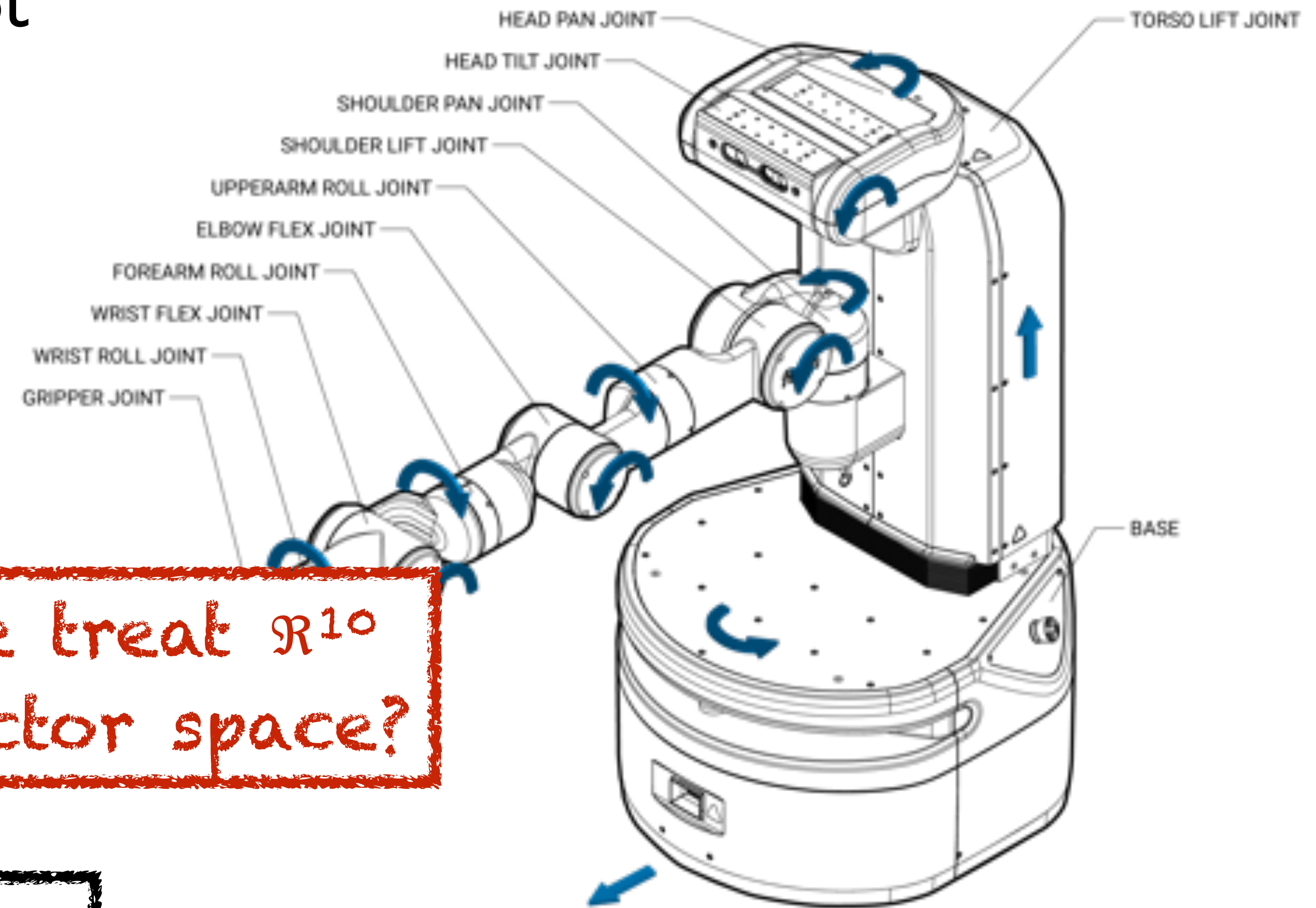


# C-space with joint limits

- What is the C-space of a Fetch, not including grippers?
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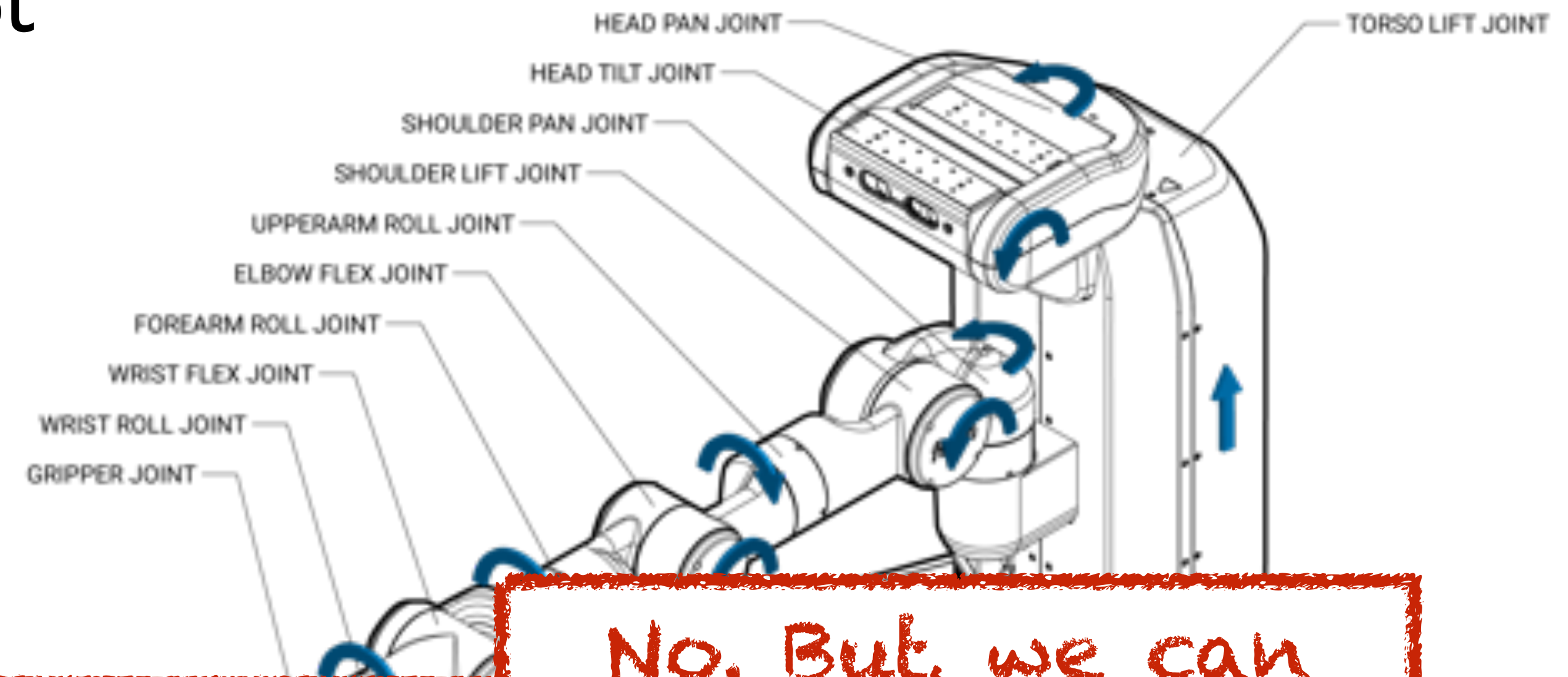
Can we treat  $\mathbb{R}^{10}$   
as a vector space?

C-space:  $SE(2) \times \mathbb{R}^{10}$



# C-space with joint limits

- What is the C-space of a Fetch, not including grippers?
- DOFs: 13
  - 3 in base:  $SE(2)$
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Can we treat  $\mathbb{R}^{10}$  as a vector space?

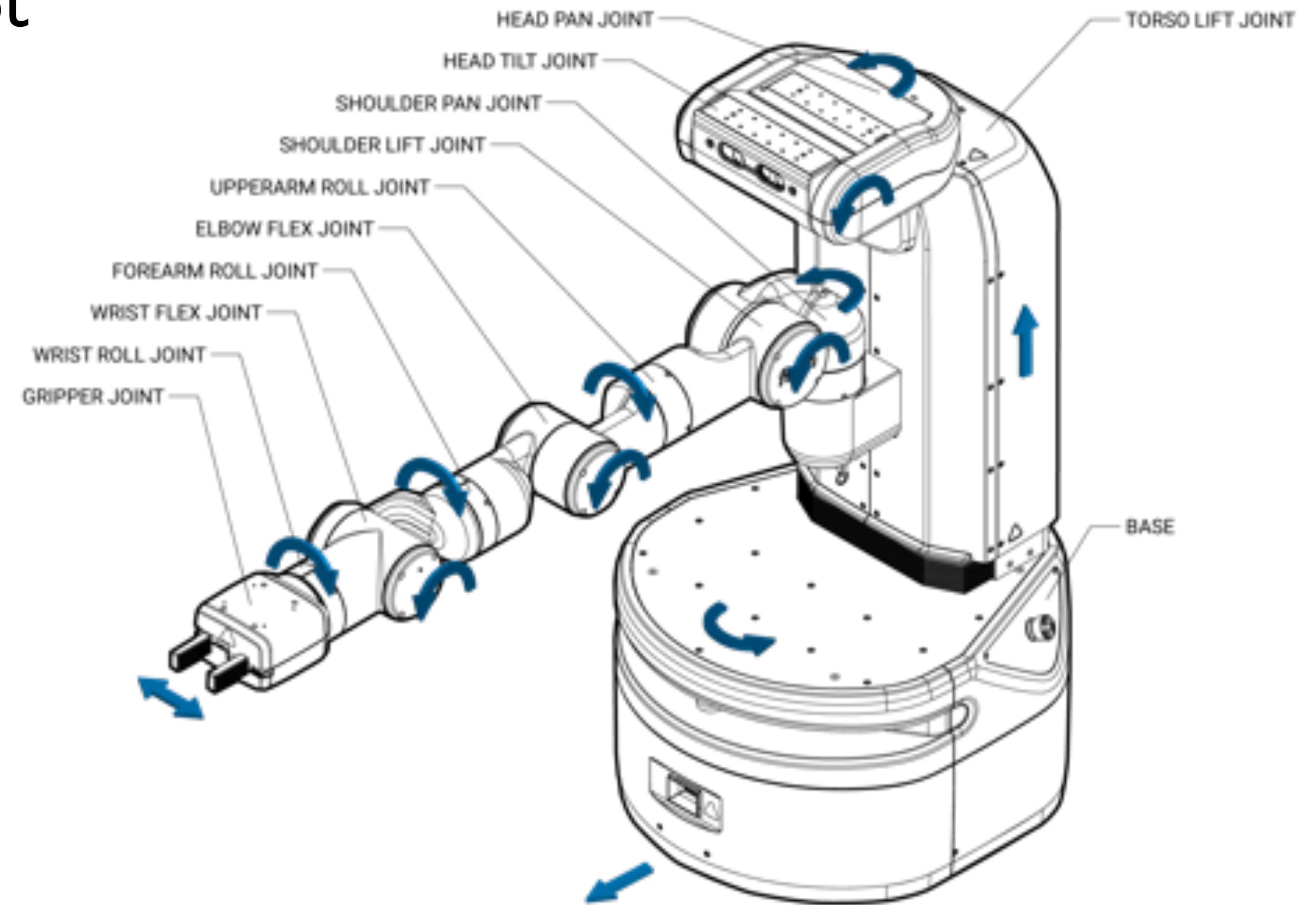
No. But, we can sample C-space using vector operations

C-space:  $SE(2) \times \mathbb{R}^{10}$



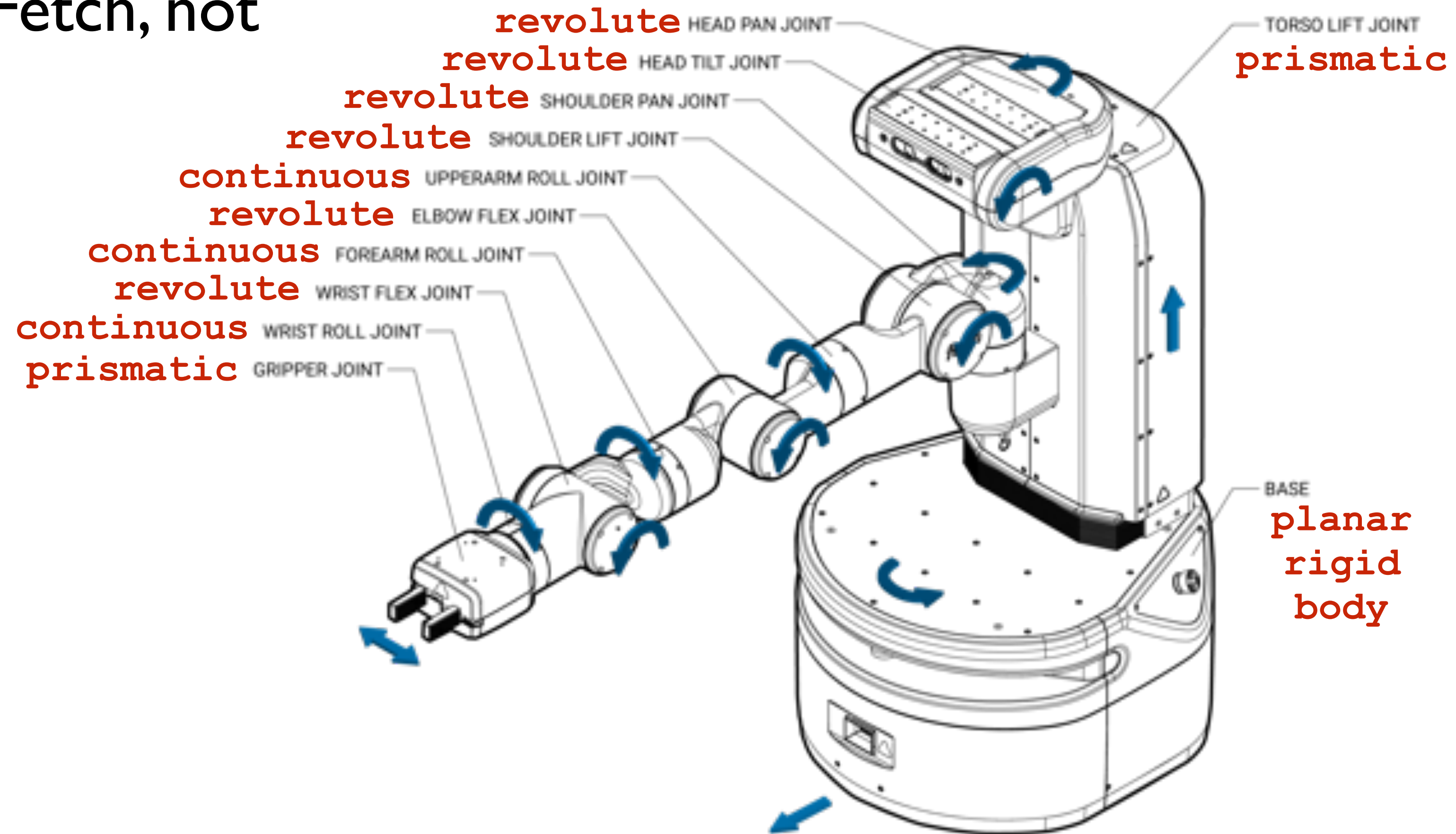
# Still not quite right...

- What is the C-space of a Fetch, not including grippers?
- DOFs: 13
  - 3 in base:  $SE(2)$
  - 7 in arm:  ~~$\mathbb{R}^7$~~
  - 1 in the spine:  $\mathbb{R}^1$
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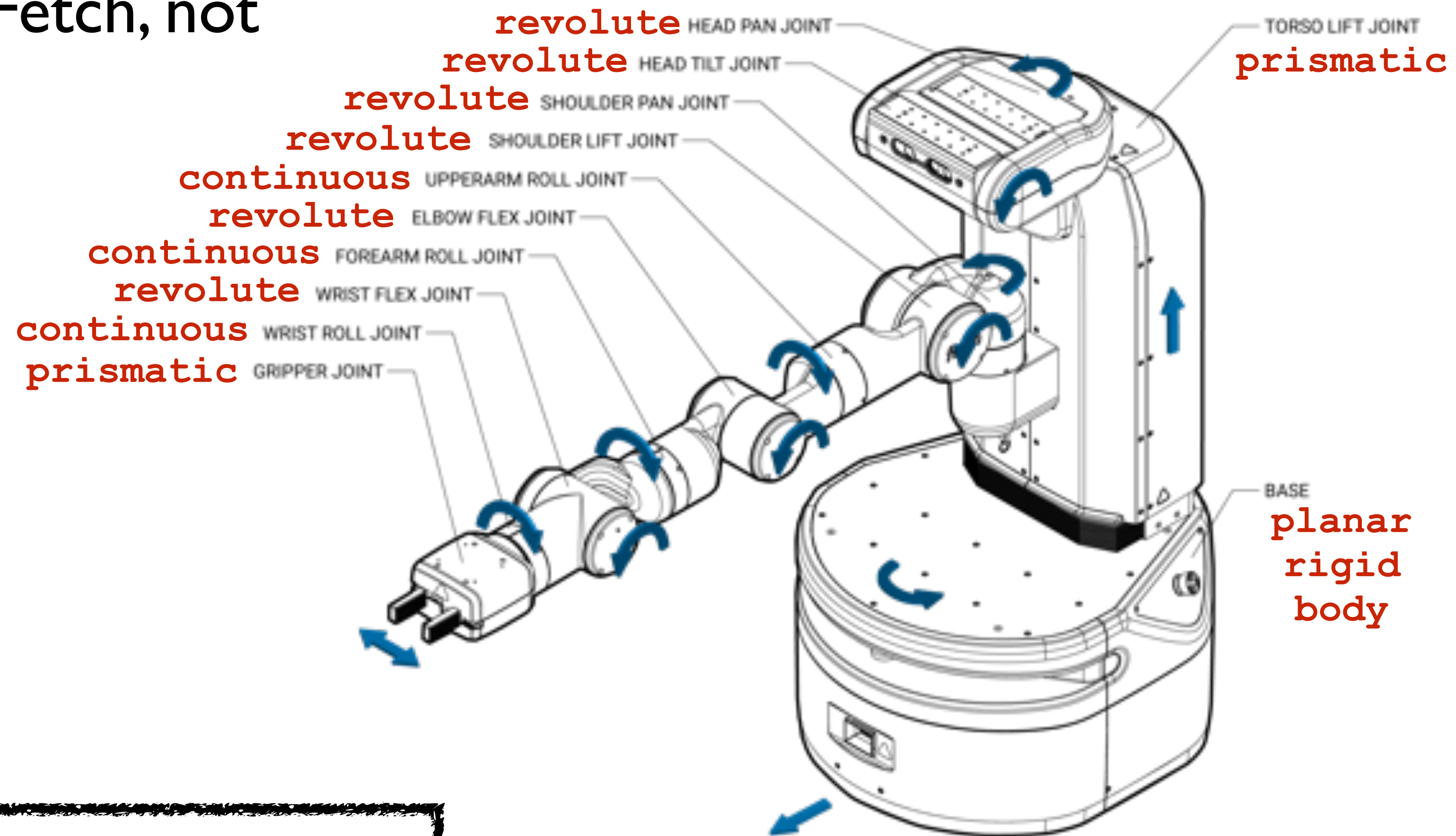
# Still not quite right...

- What is the C-space of a Fetch, not including grippers?
- DOFs: 13
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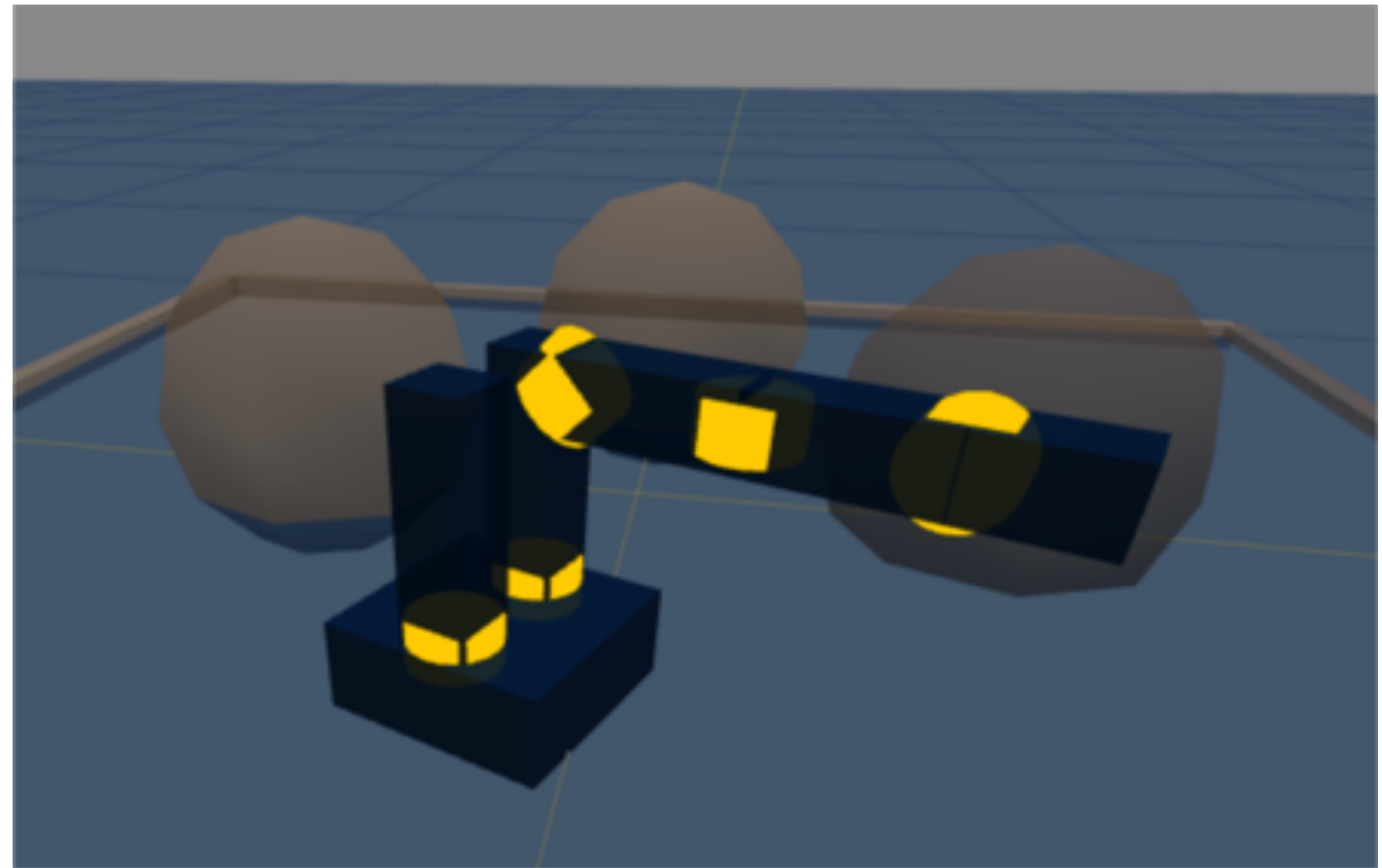
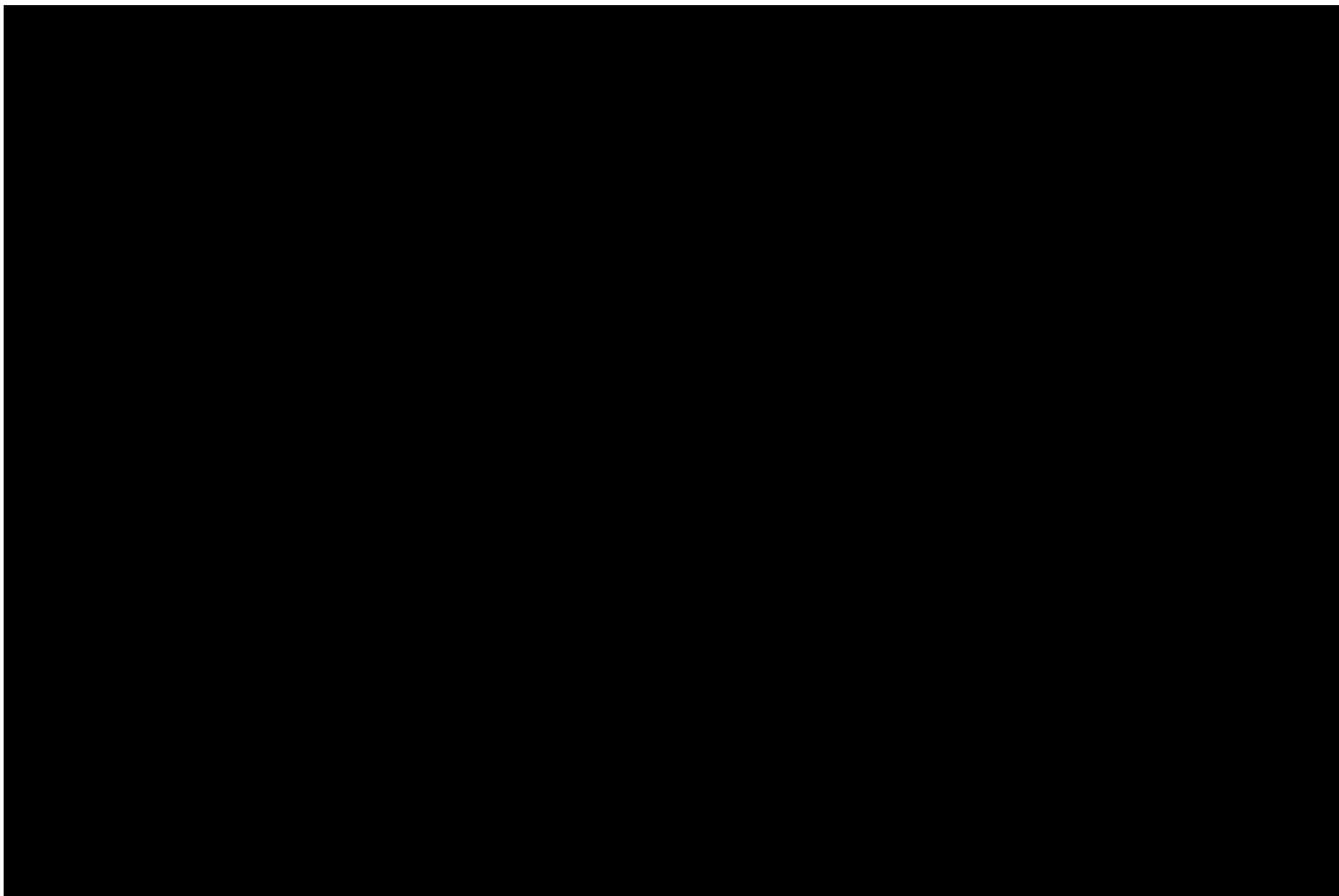
- What is the C-space of a Fetch, not including grippers?
- DOFs: 13
  - 3 in base:  $SE(2)$
  - 3 continuous:  $T^3$
  - 1 prismatic:  $\mathbb{R}^1$
  - 6 revolute:  $\mathbb{R}^6$



C-space:  $SE(2) \times T^3 \times \mathbb{R}^7$

# C-space examples

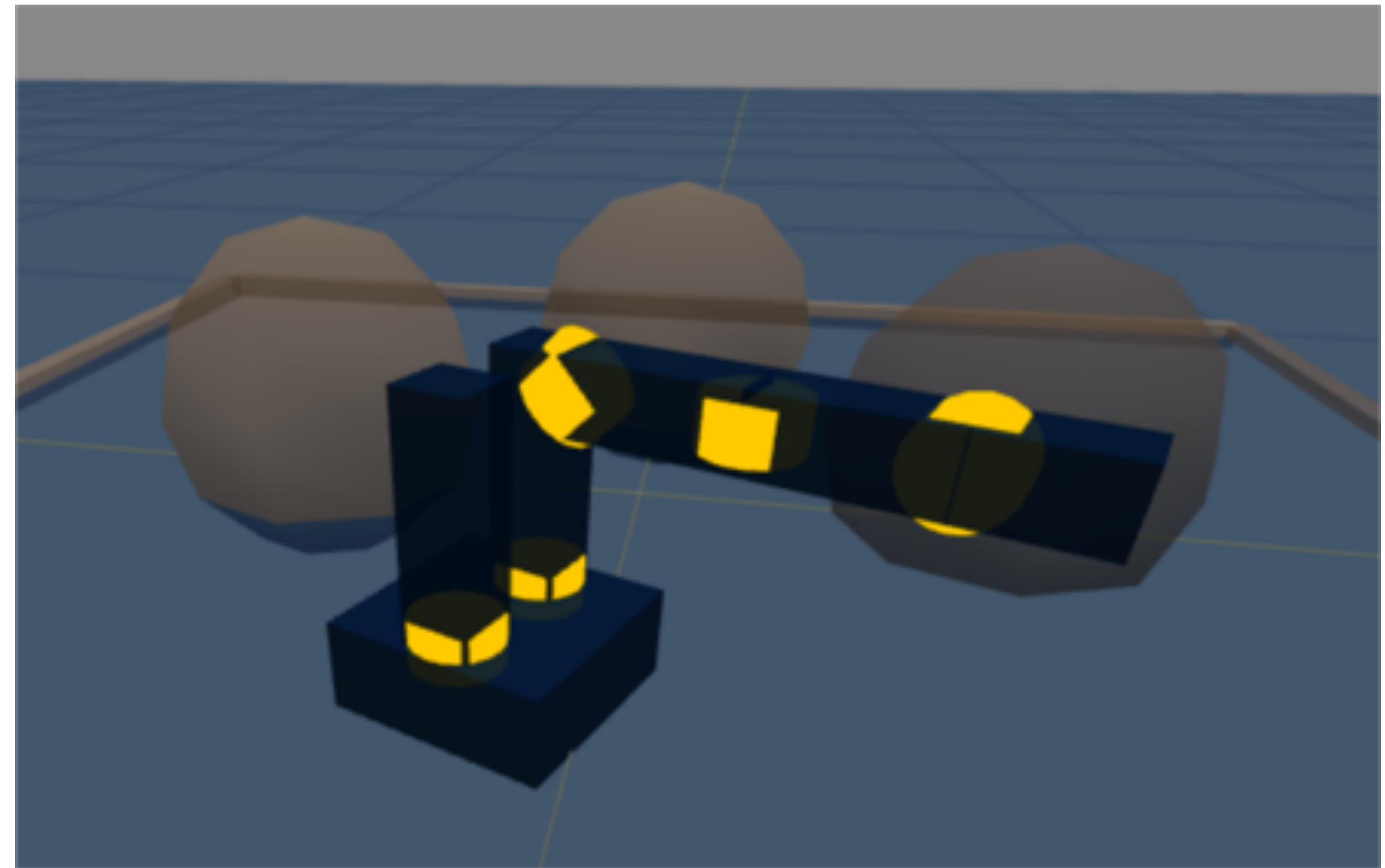
- What is the C-space of a MR2?



# C-space examples

- What is the C-space of a MR2?
- DOFs: 14
  - 3 in base:  $SE(2)$
  - 5 in arms:  $T^5$

C-space:  $SE(2) \times T^5$





# C-space examples

- What is the C-space of a Robonaut 2 on the International Space Station?
- What is the C-space of a PR2?



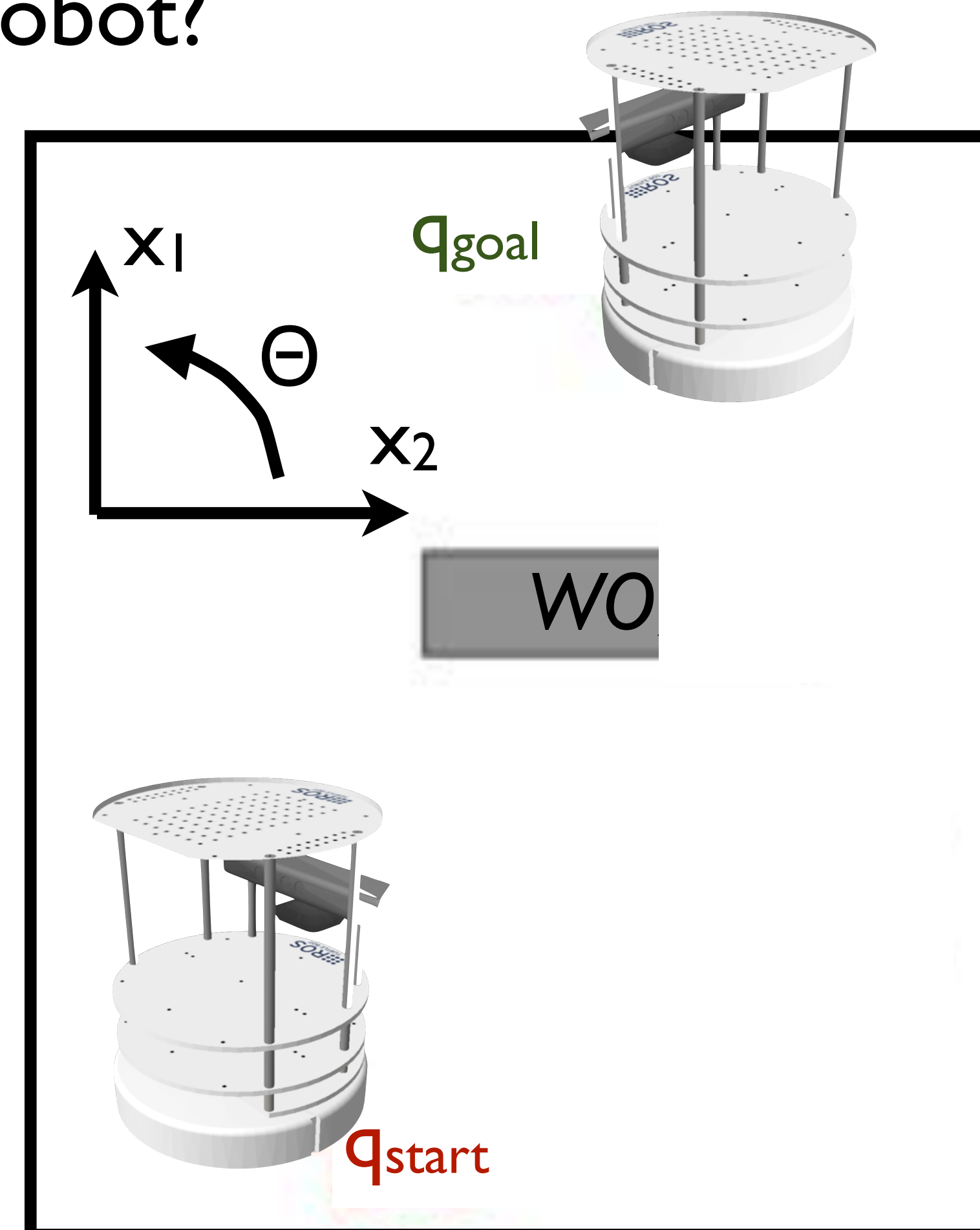
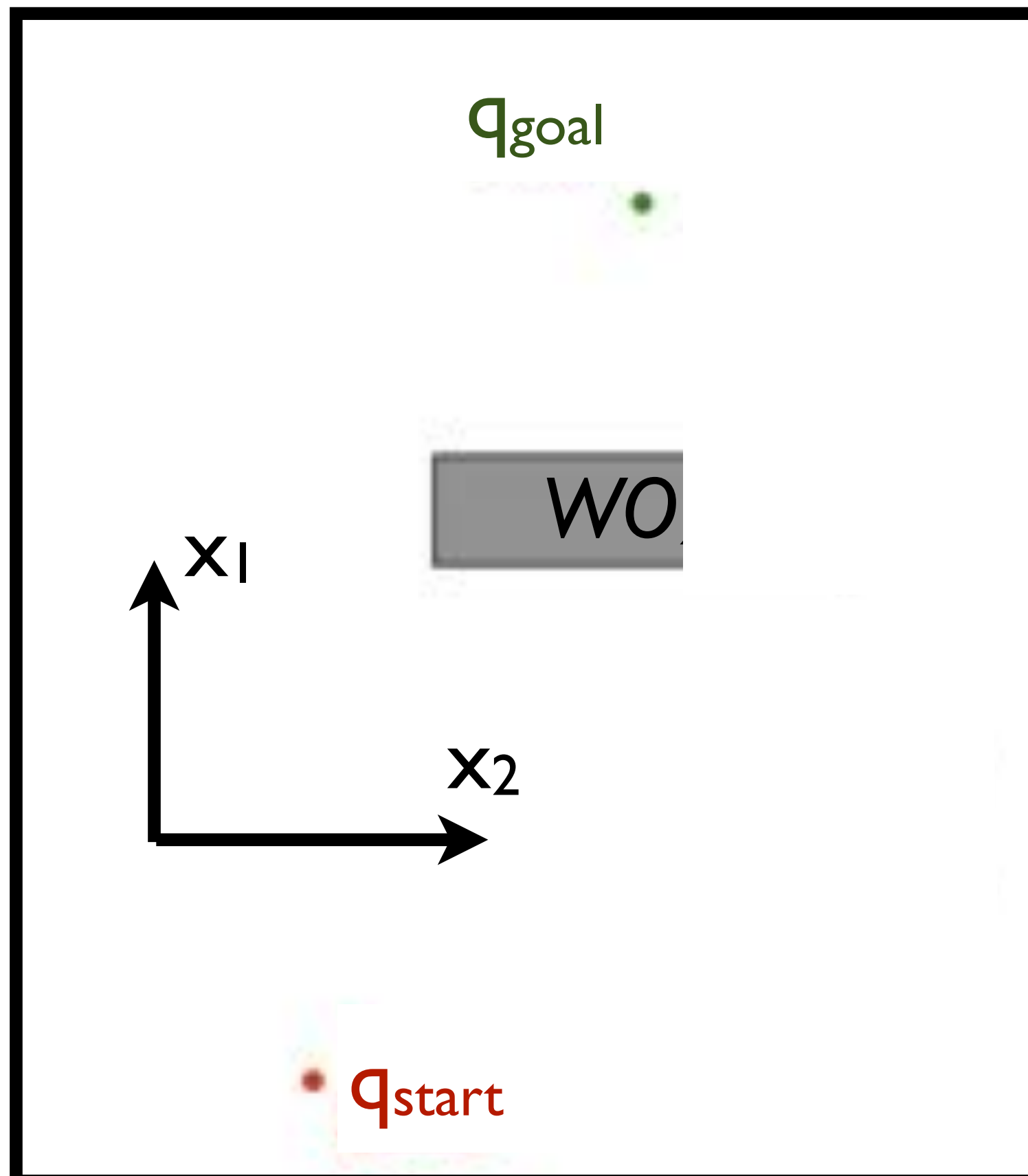


What about the robot's  
physical geometry?



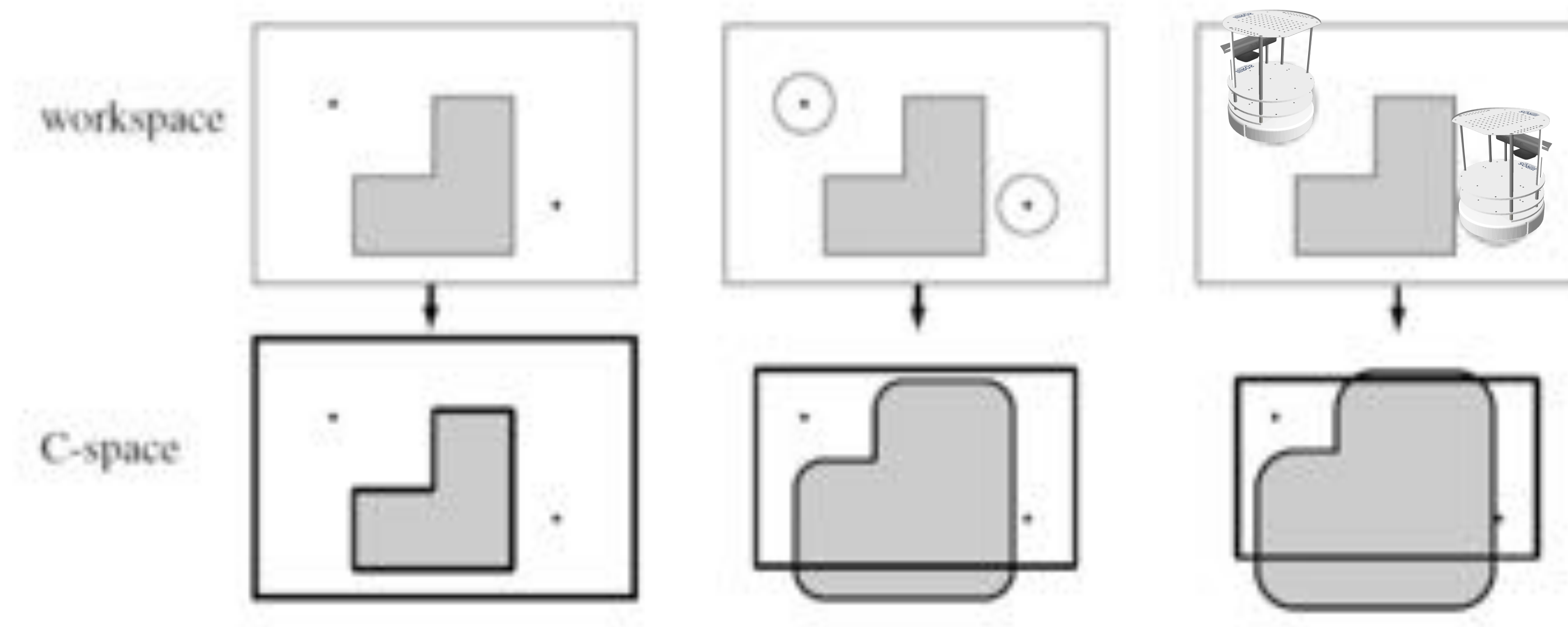
# Configuration v. Workspaces

- Other than rotation, how is the Turtlebot different than the point robot?



# Robot Geometry

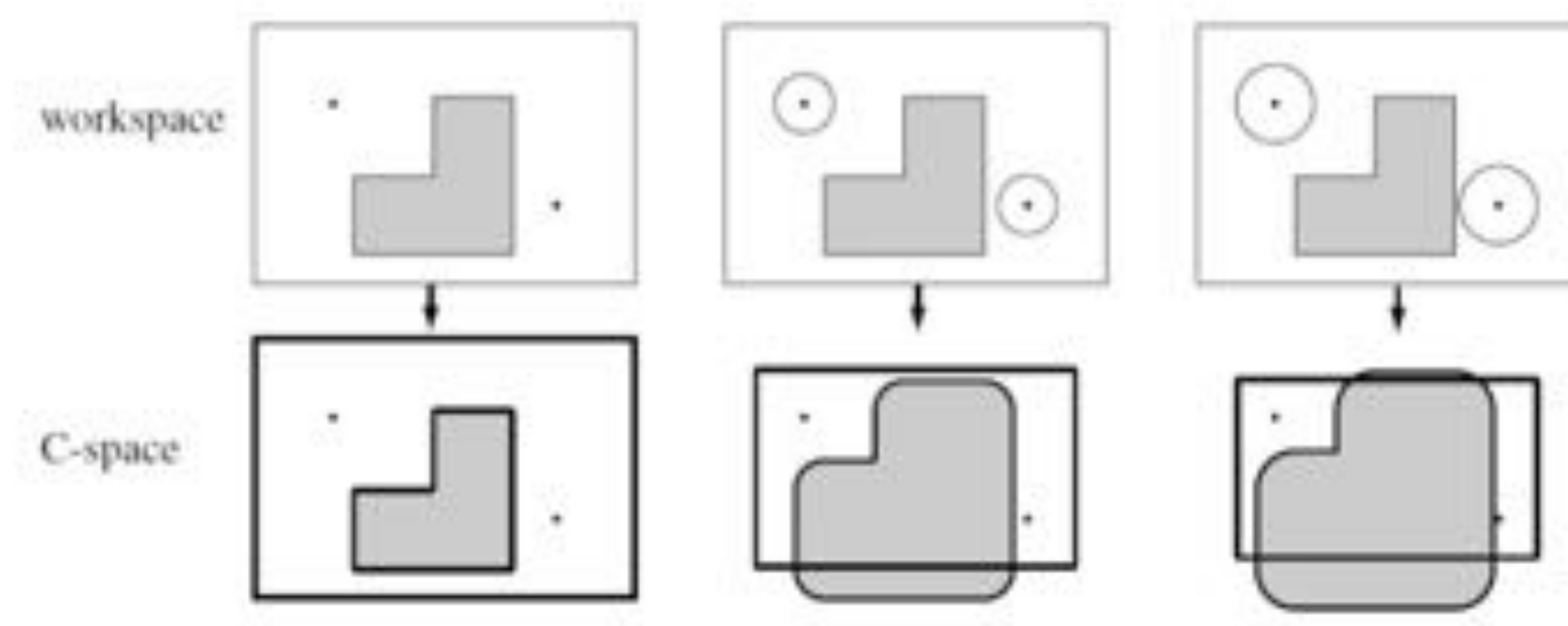
- Turtlebot is larger than a point, having a circular radius in the robot's planar workspace
- As this radius increases, the C-space shrinks



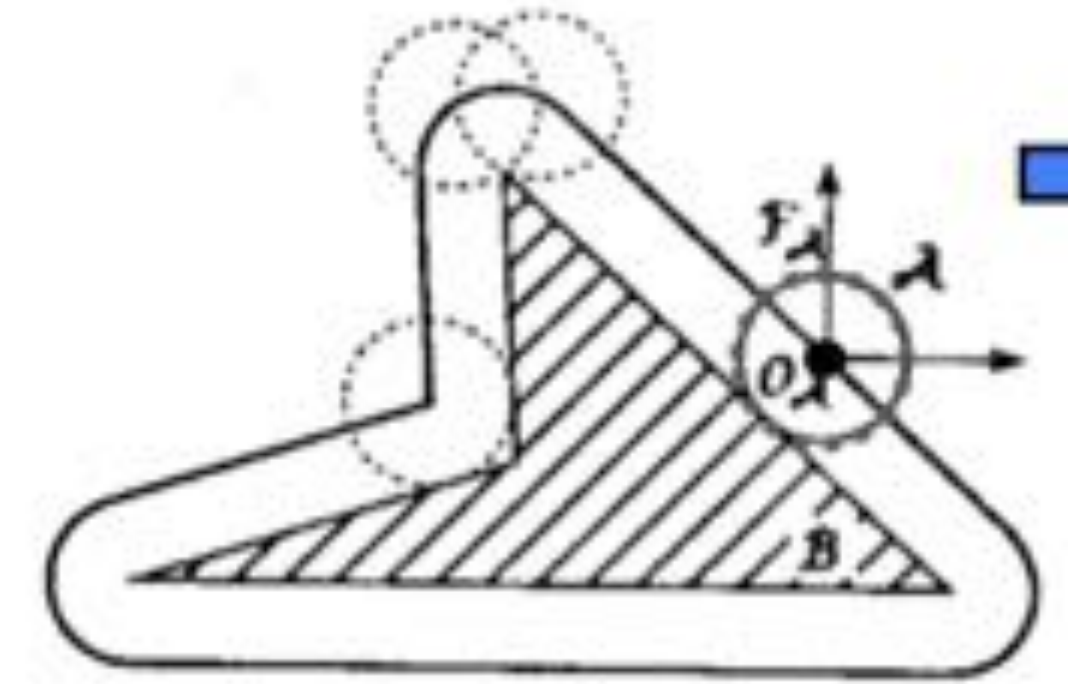


# Robot Geometry

- Turtlebot is larger than a point, having a circular radius in the robot's planar workspace
- As this radius increases, the C-space shrinks



# Conversion to point robot C-space

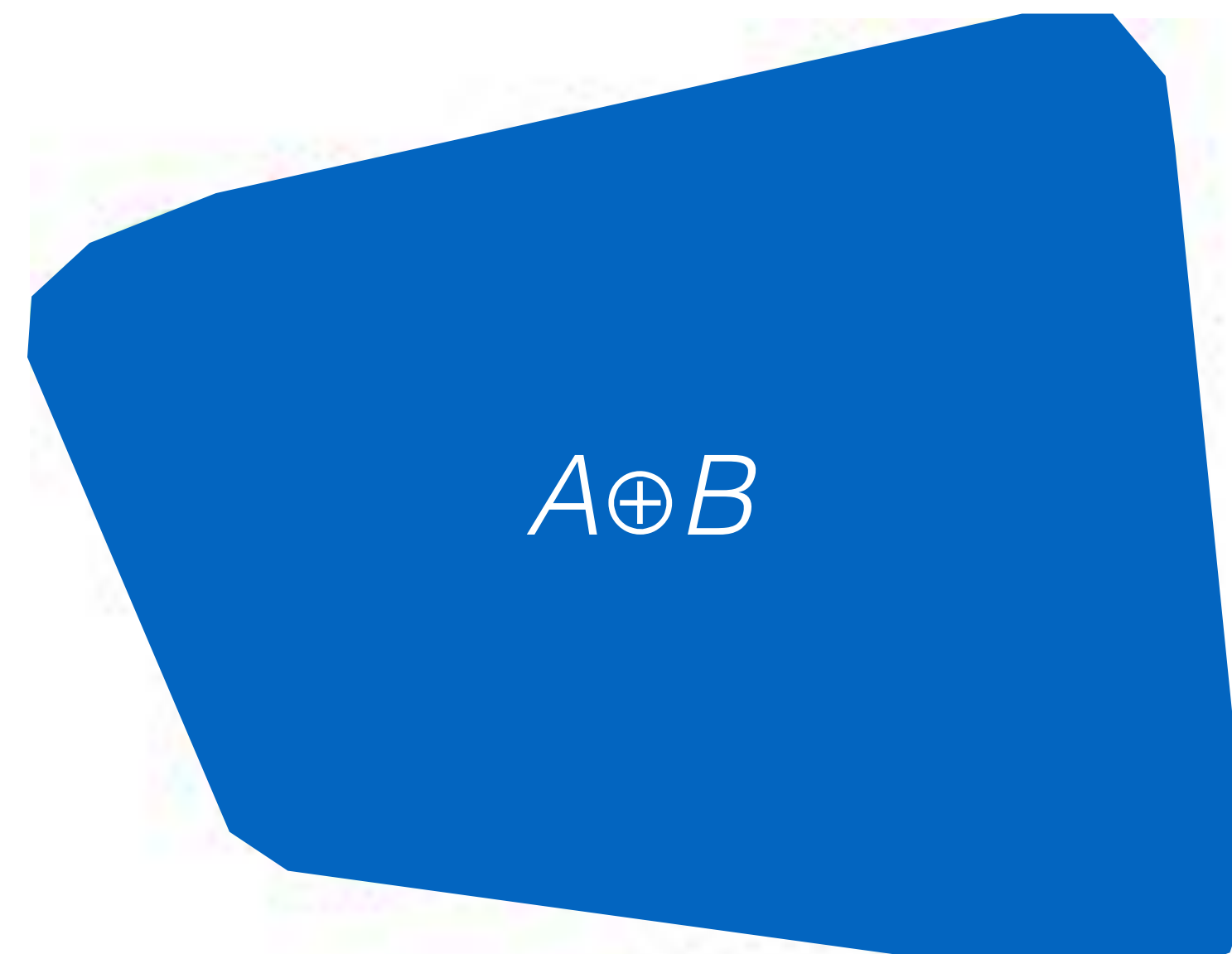
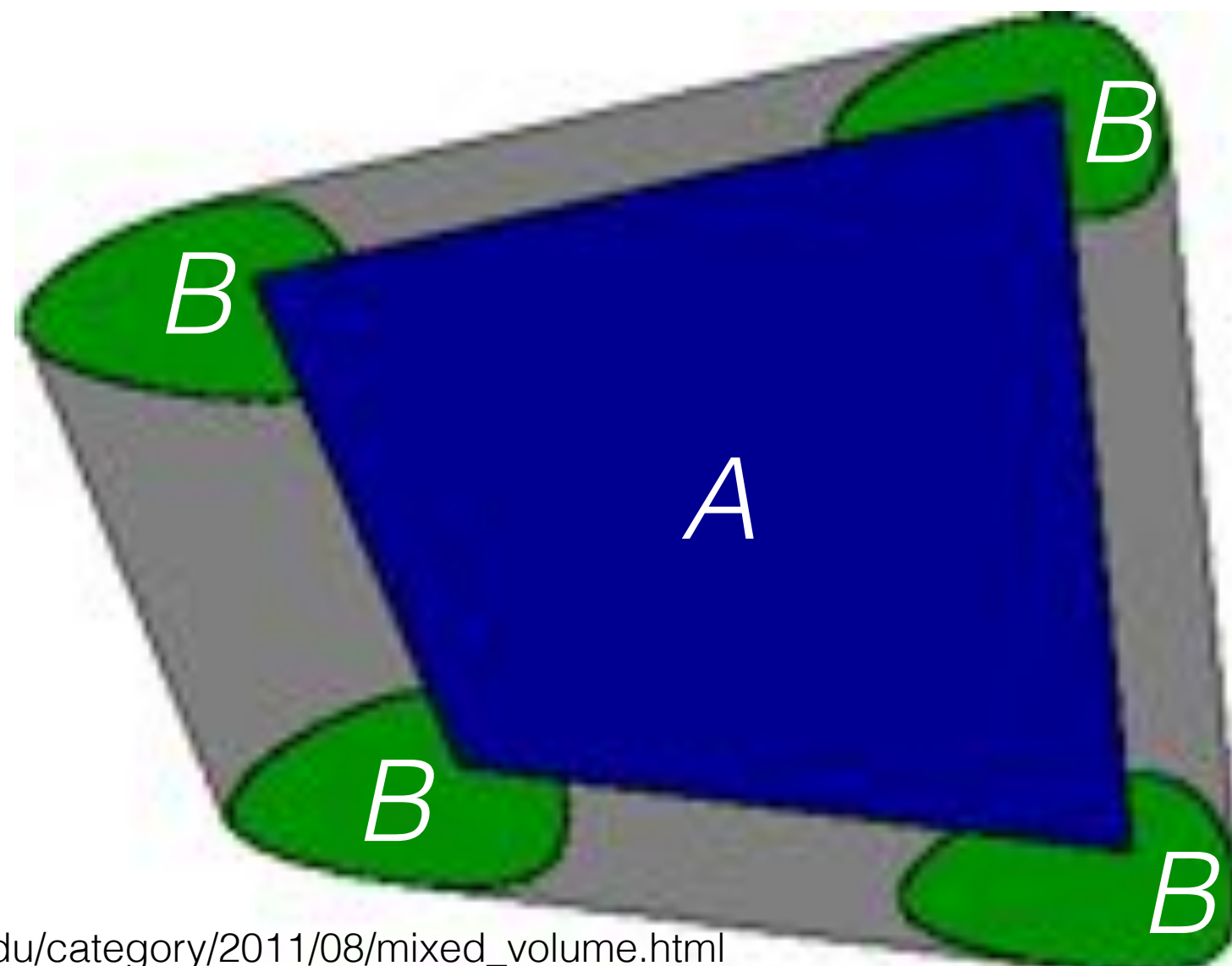


- Workspace for robot can be converted to point robot C-space
- Expand obstacles by tracing robot geometry along boundary
- Computable by Minkowski sum



# Minkowski Sum (or morphological dilation)

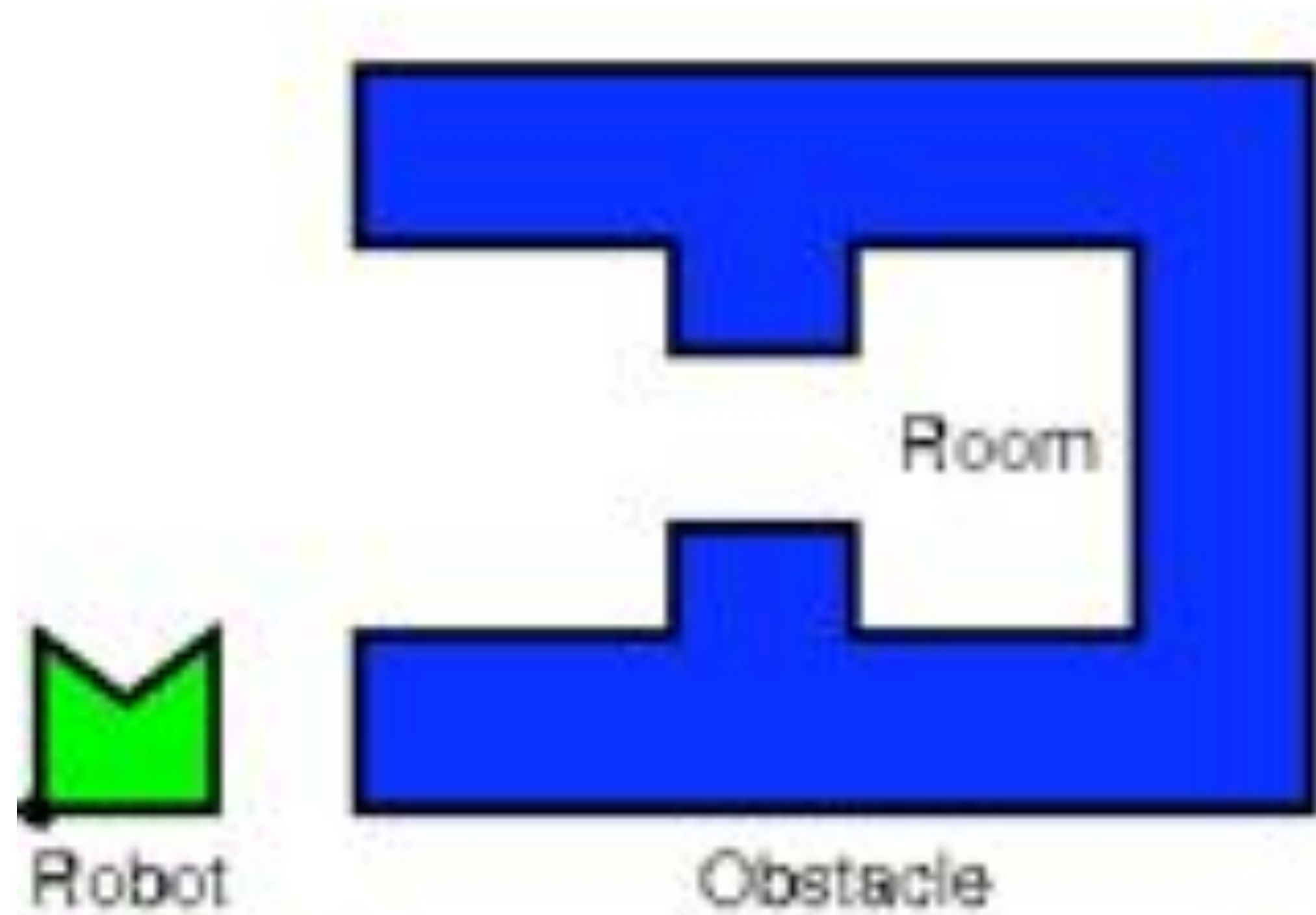
- $A \oplus B: \{a+b \mid a \in A, b \in B\}$ 
  - The result of adding every element of  $A$  to every element of  $B$ , given two sets  $A$  and  $B$  in Euclidean space
- Similarly, Minkowski difference (morphological erosion)
  - $A \ominus B: \{a-b \mid a \in A, b \in B\}$



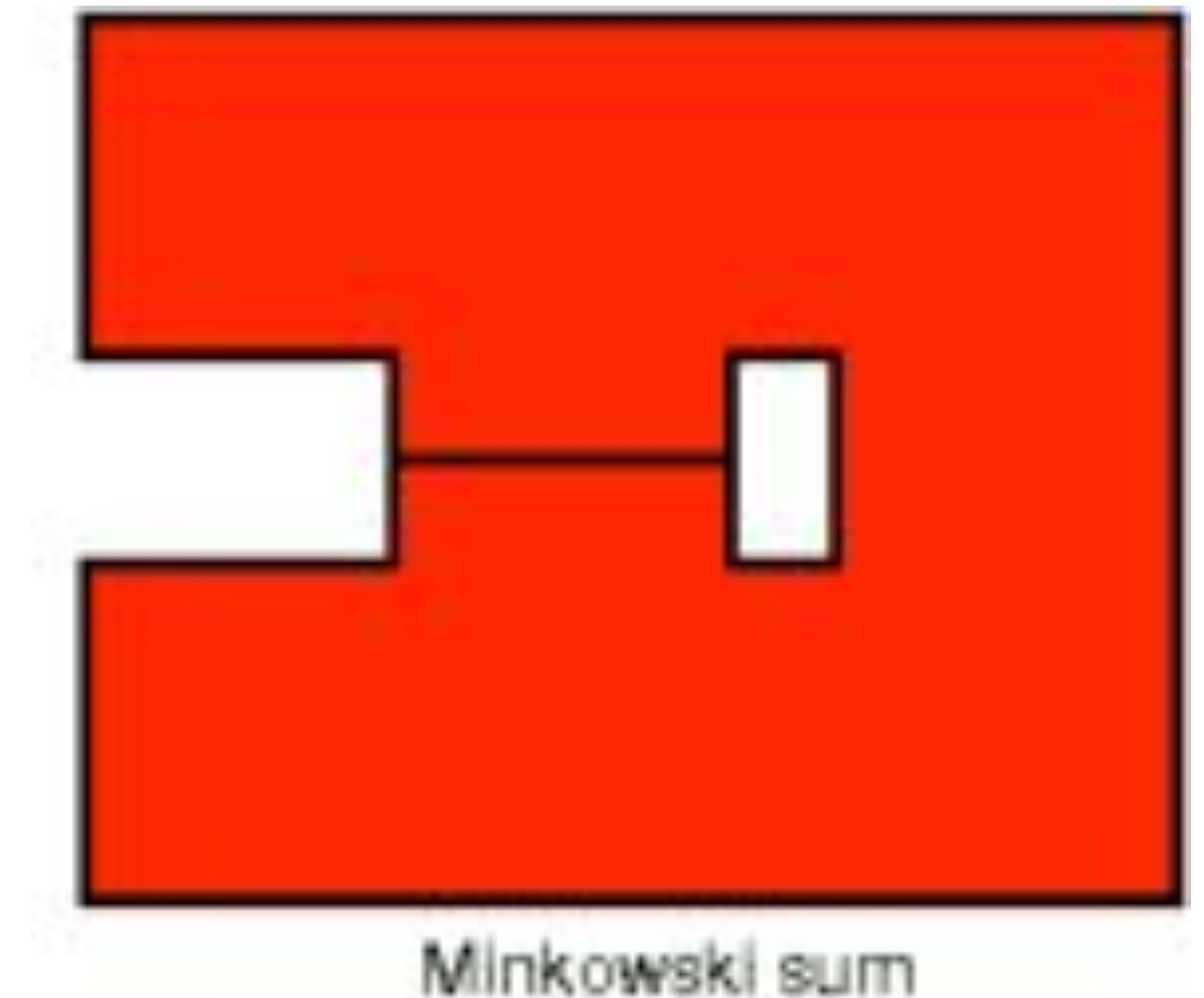


# Minkowski Planning

Given



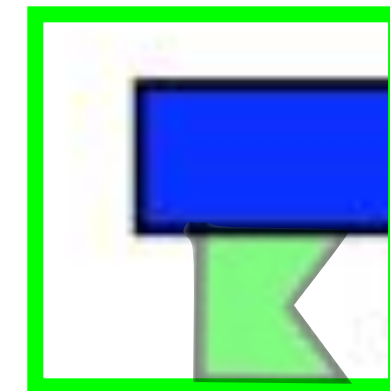
Compute



# Minkowski Planning

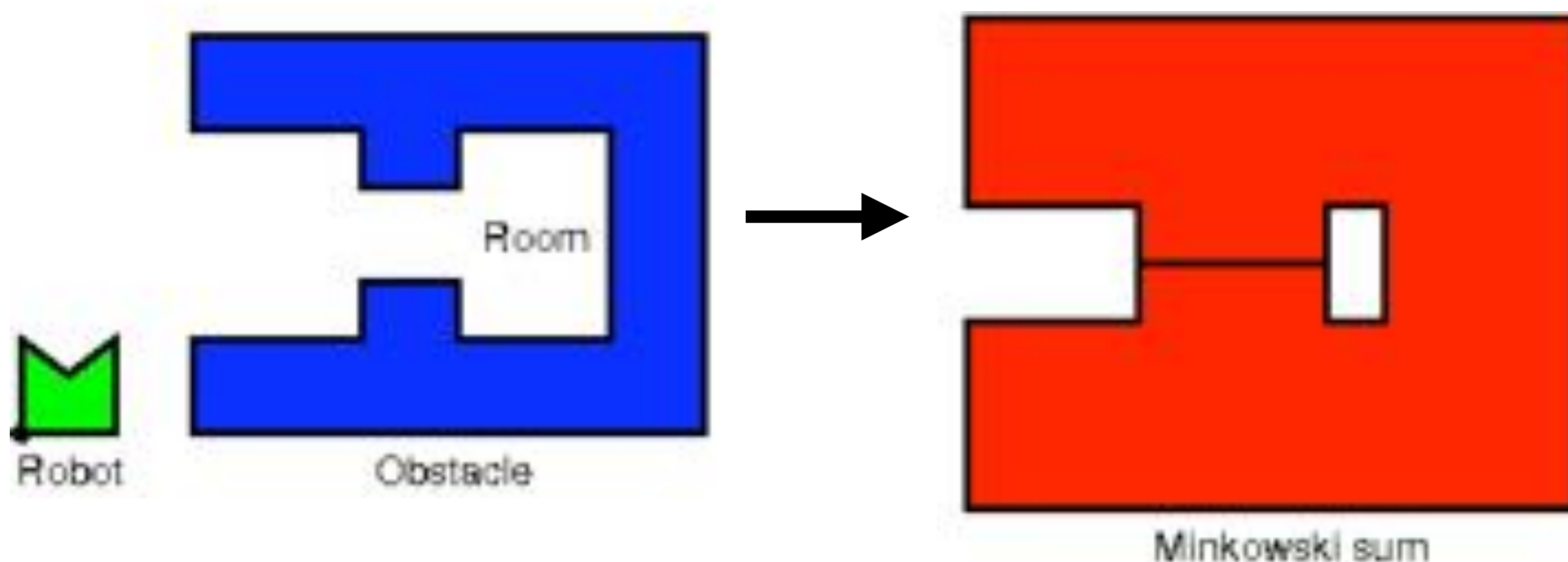


Occlude location if robot intersects obstacle



Leave location free if robot non-intersecting with object

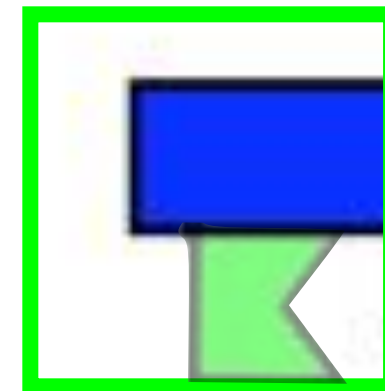
*Minkowski sum*: identify non intersecting robot locations



# Minkowski Planning

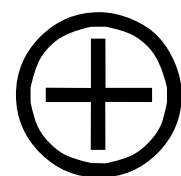


Occlude location if robot intersects obstacle

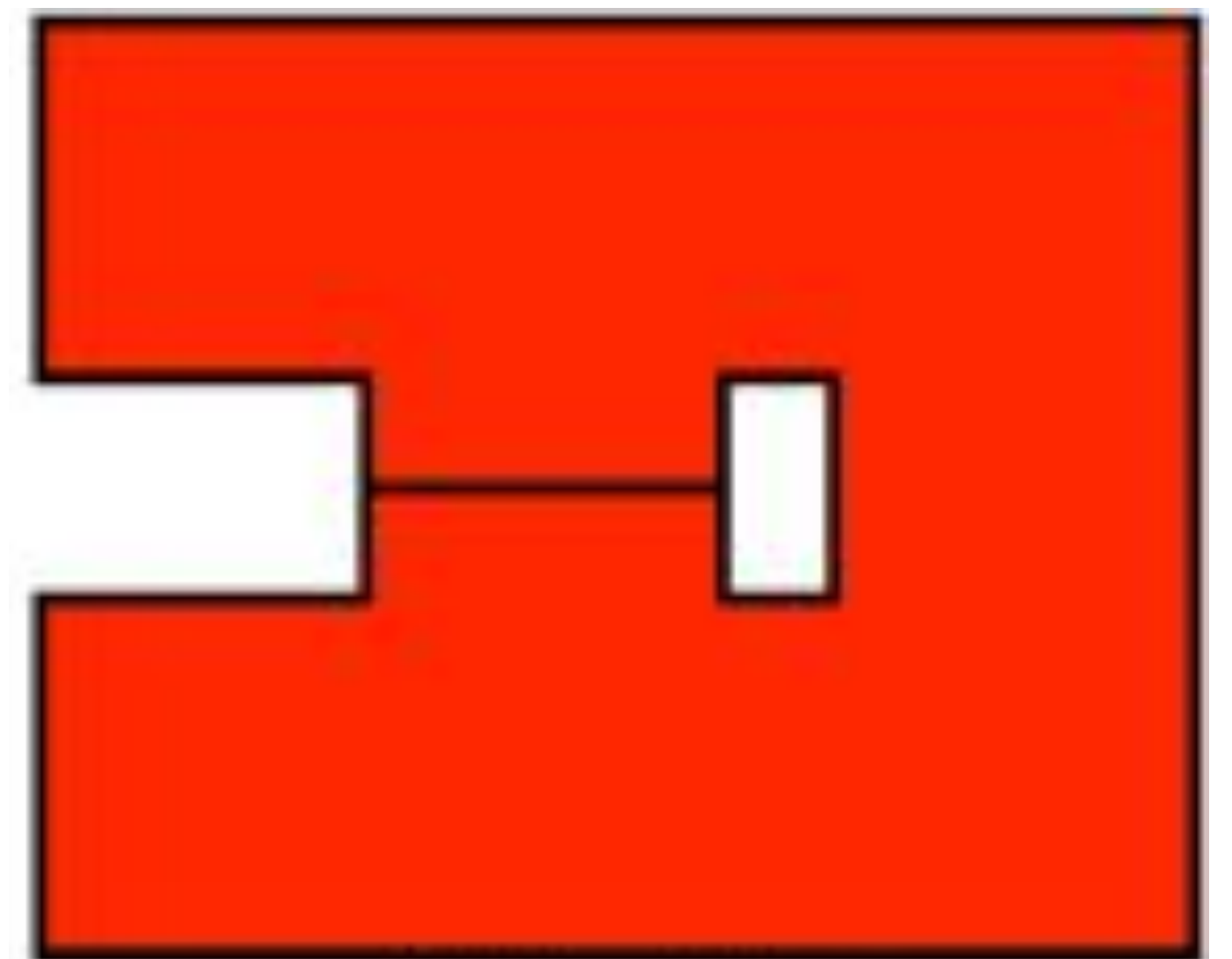
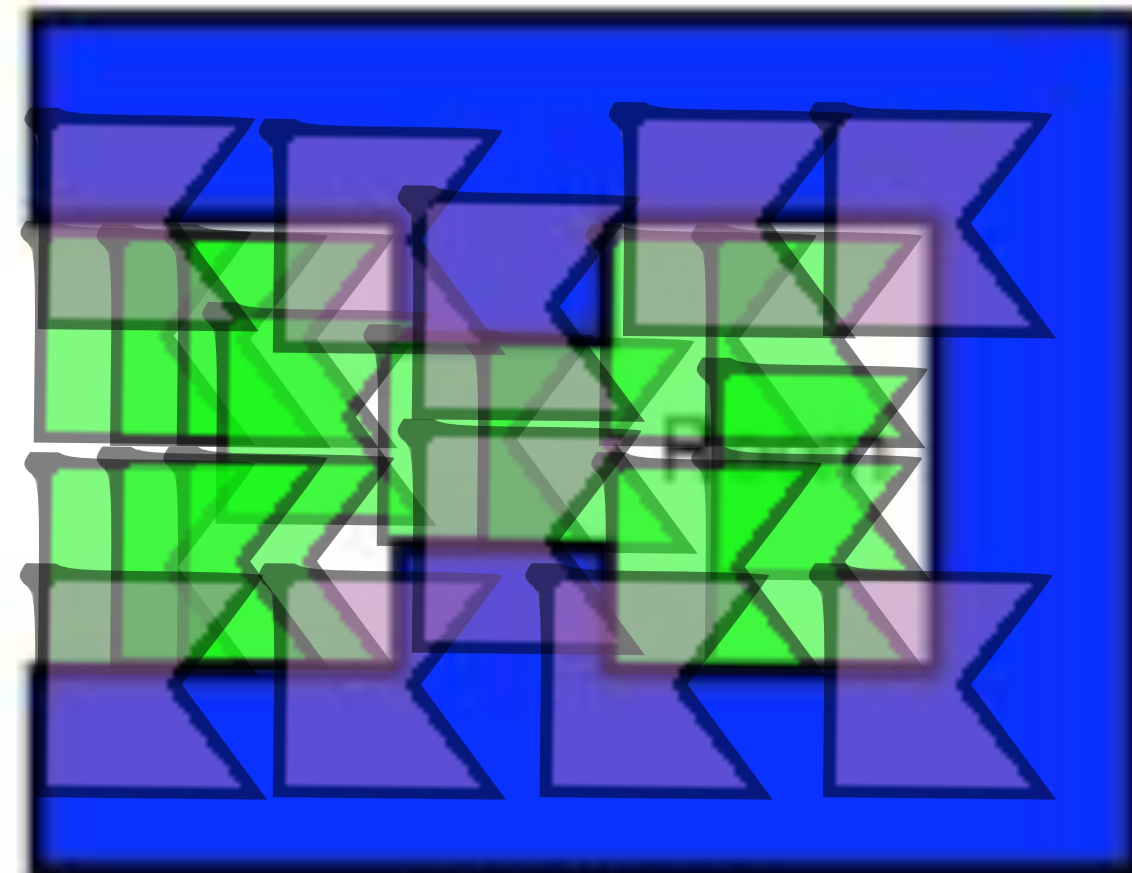


Leave location free if robot non-intersecting with object

**Minkowski sum:** identify non intersecting robot locations



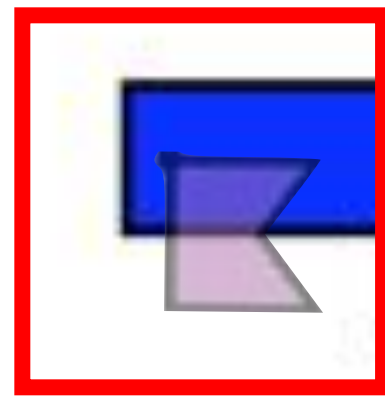
Robot geometry



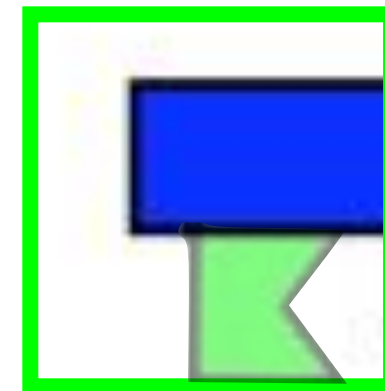
Space of valid paths defined by Minkowski sum



# Minkowski Planning

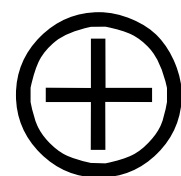


Occlude location if robot intersects obstacle

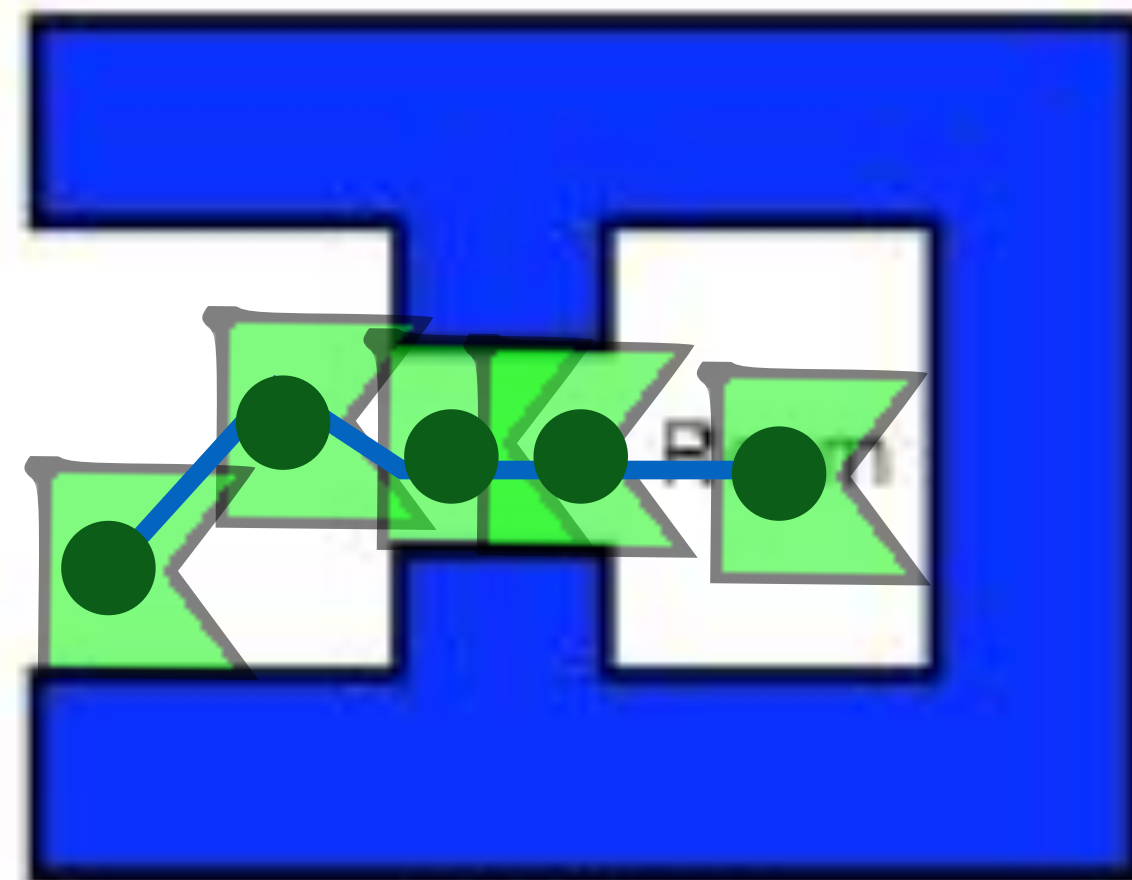


Leave location free if robot non-intersecting with object

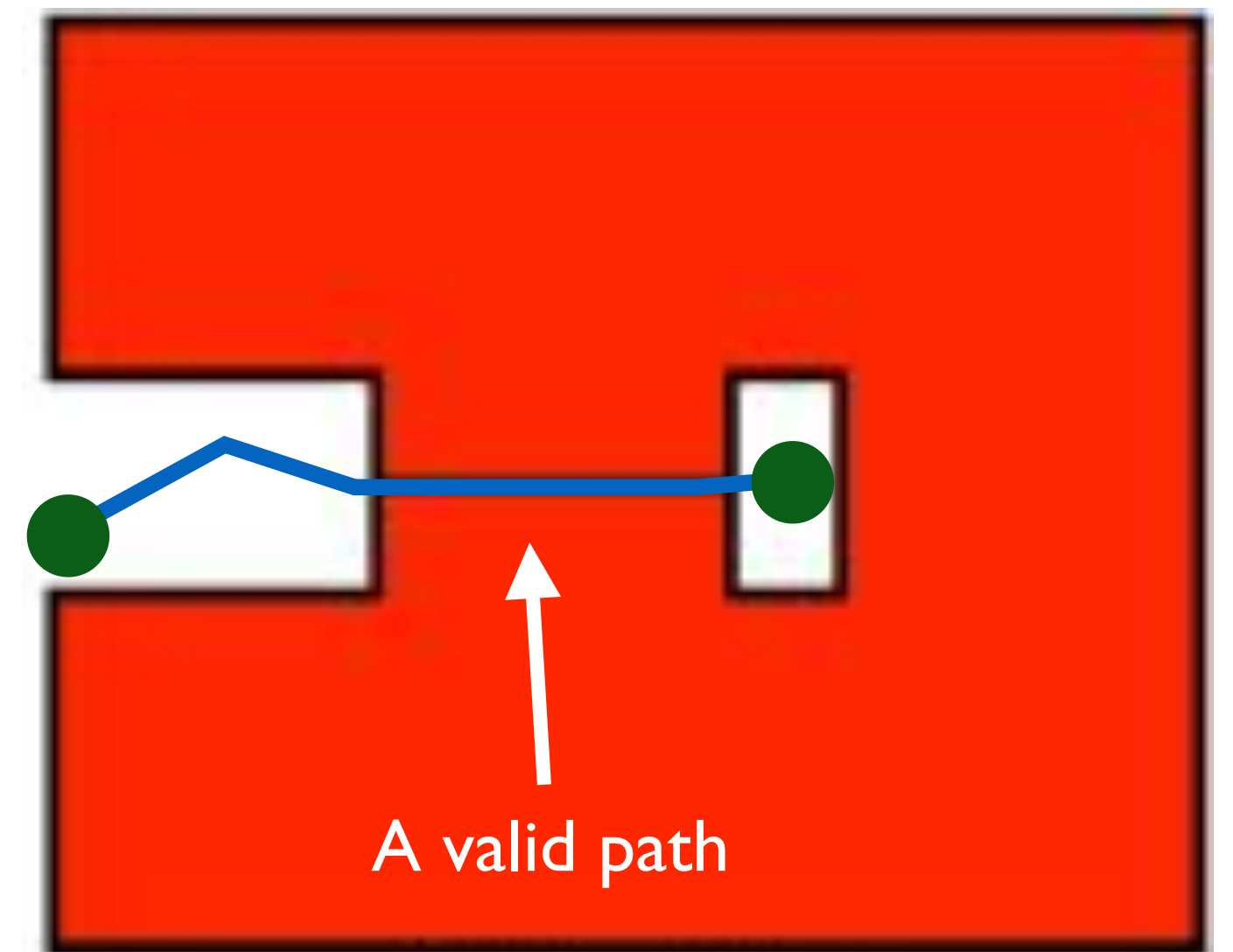
*Minkowski sum*: identify non intersecting robot locations



Robot geometry



=



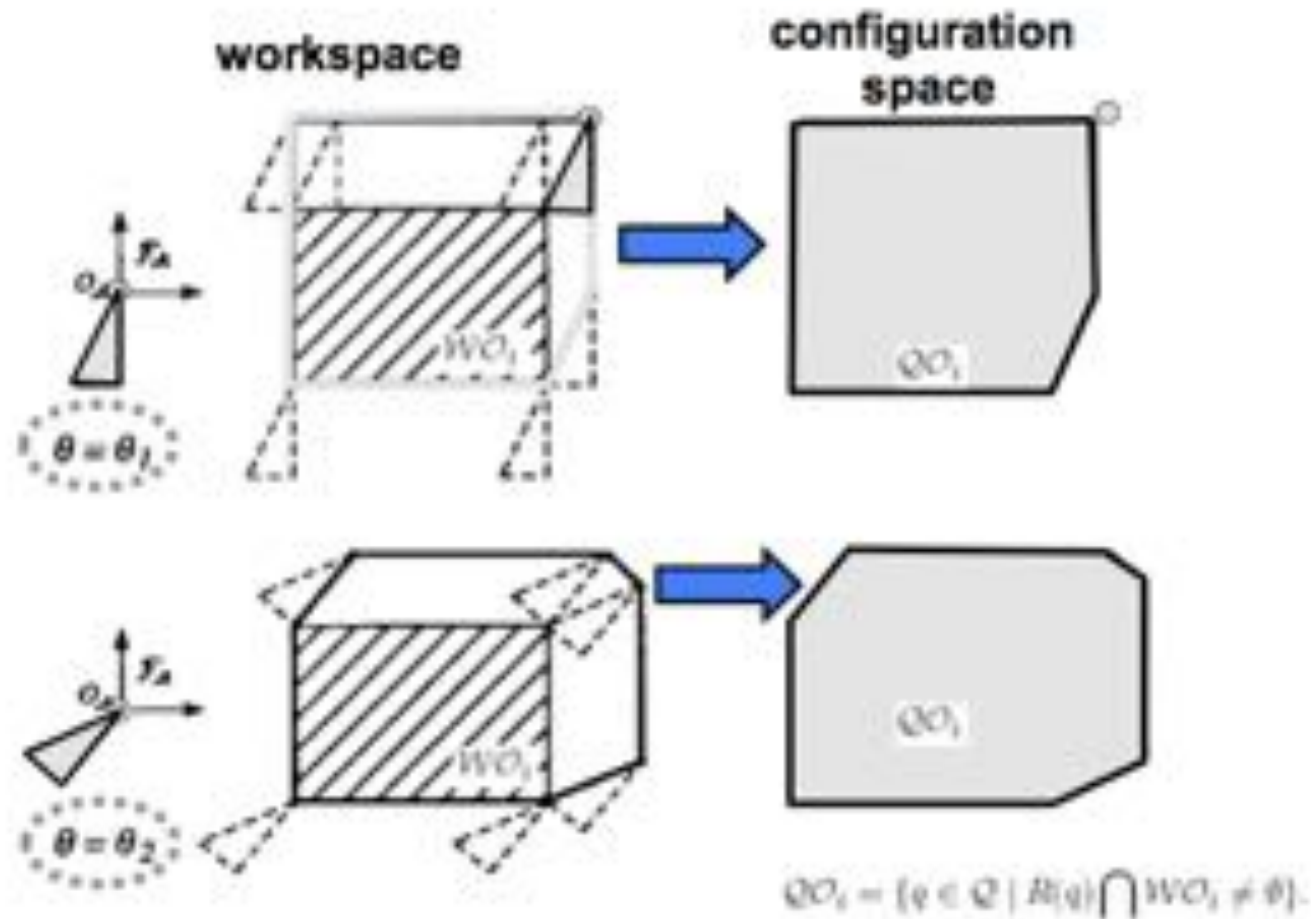
A valid path

Space of valid paths defined by Minkowski sum

What does an obstacle look like  
in configuration space?

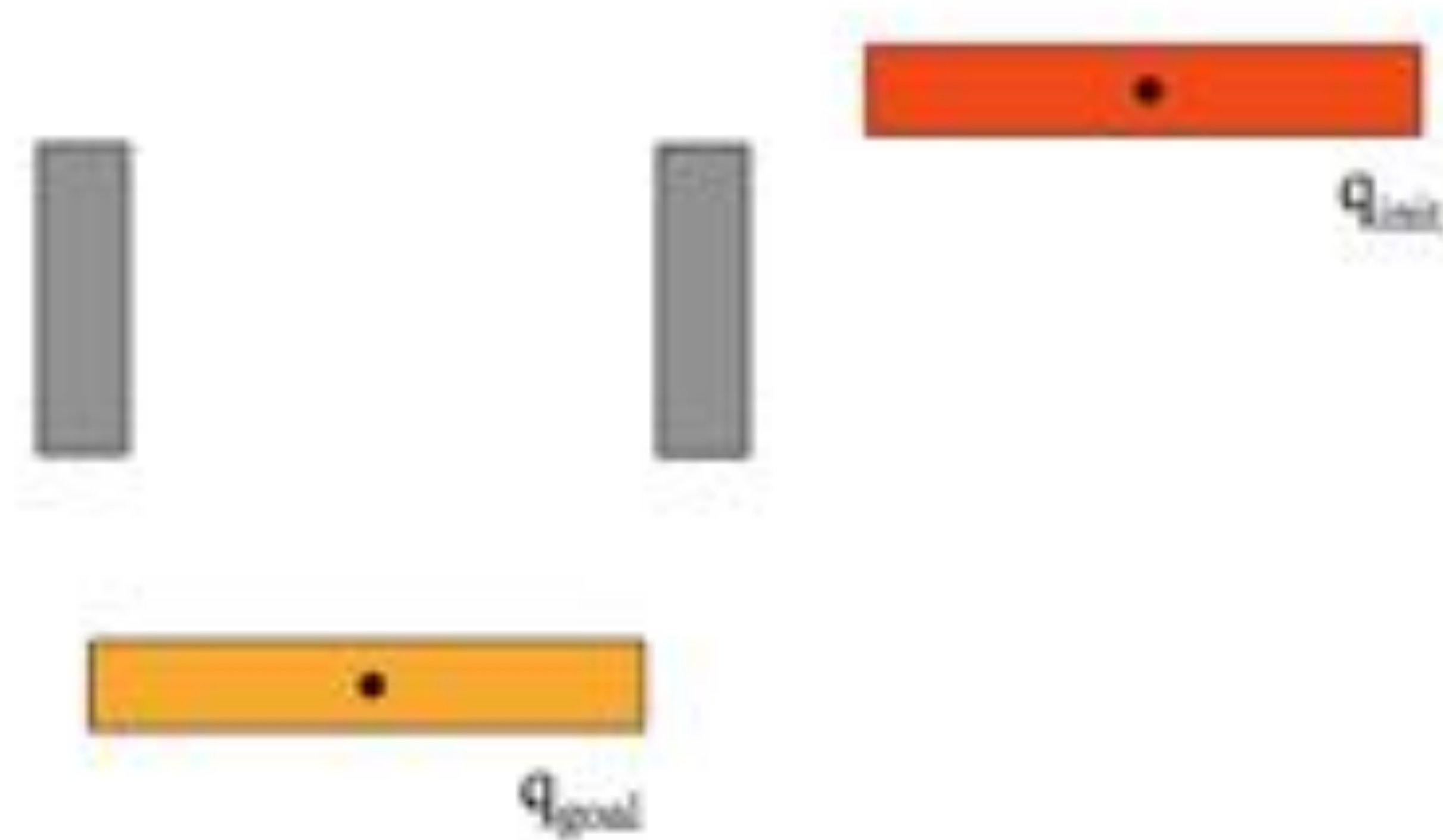


# C-space depends on rotation

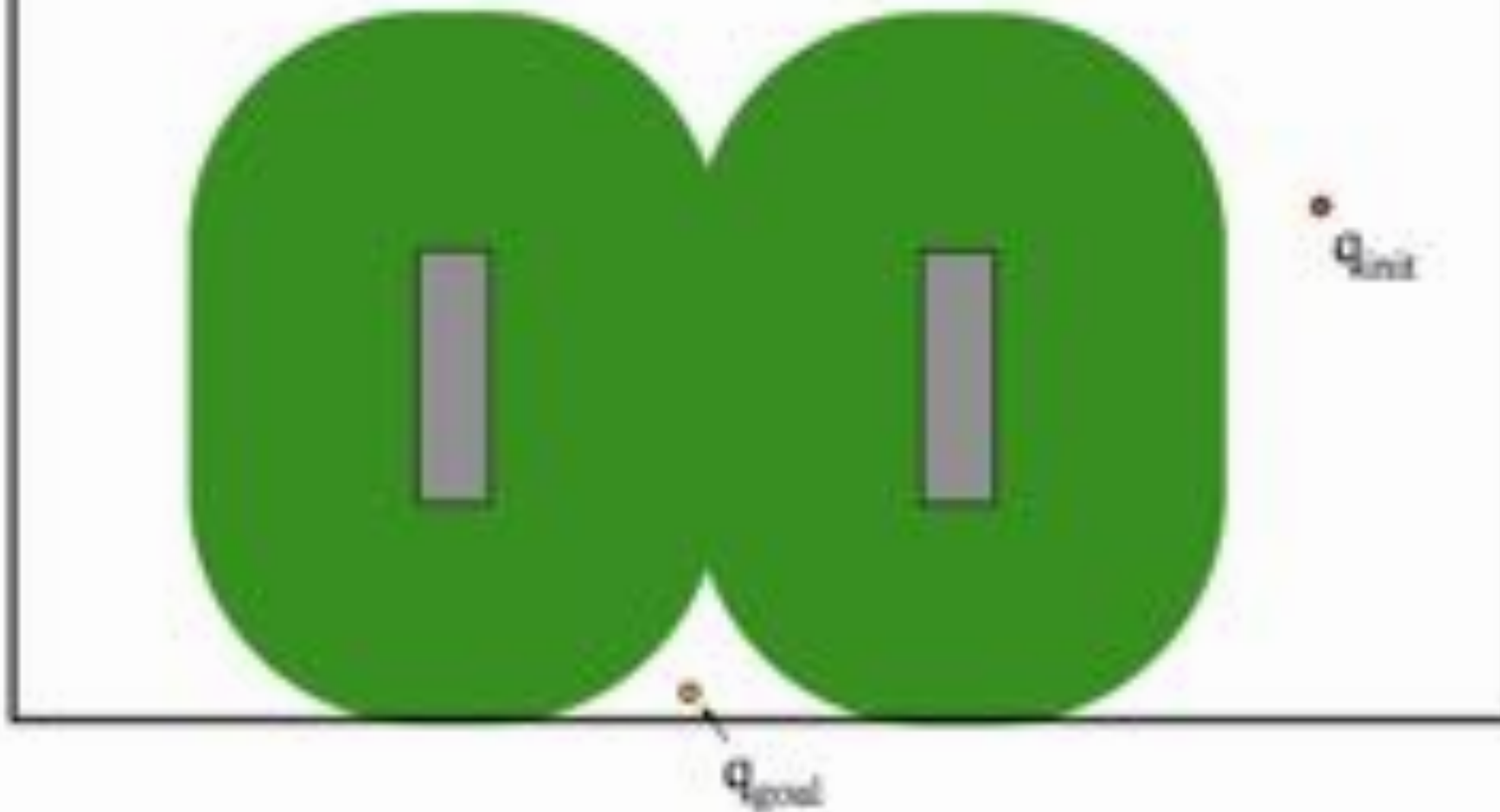




Consider this workspace...



C-space where obstacles are grown with all possible object positions and orientations



C-space where obstacles are grown with all possible object positions, orientation constrained to 45 degrees



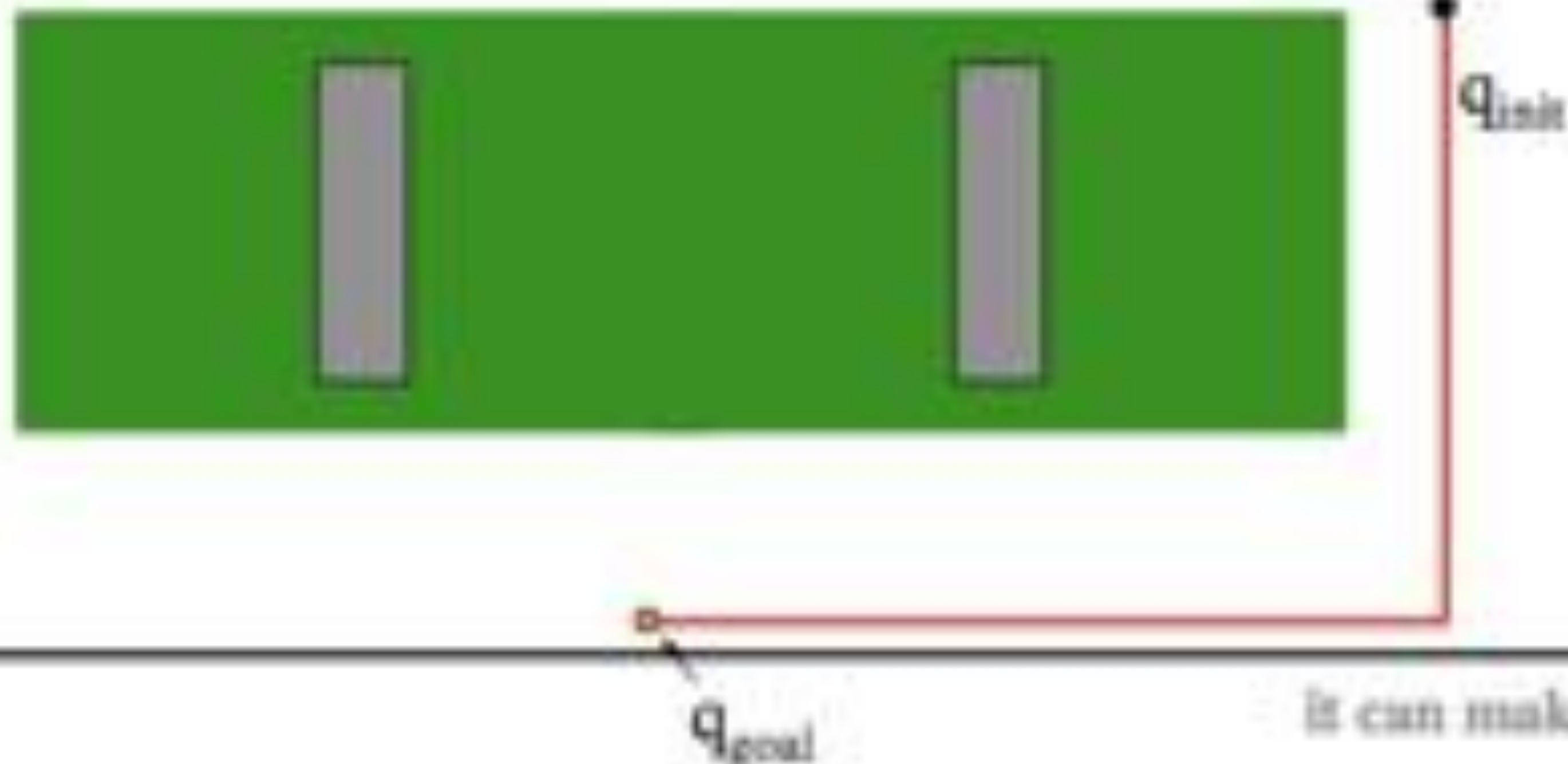
$q_{init}$

$q_{goal}$

It depends...

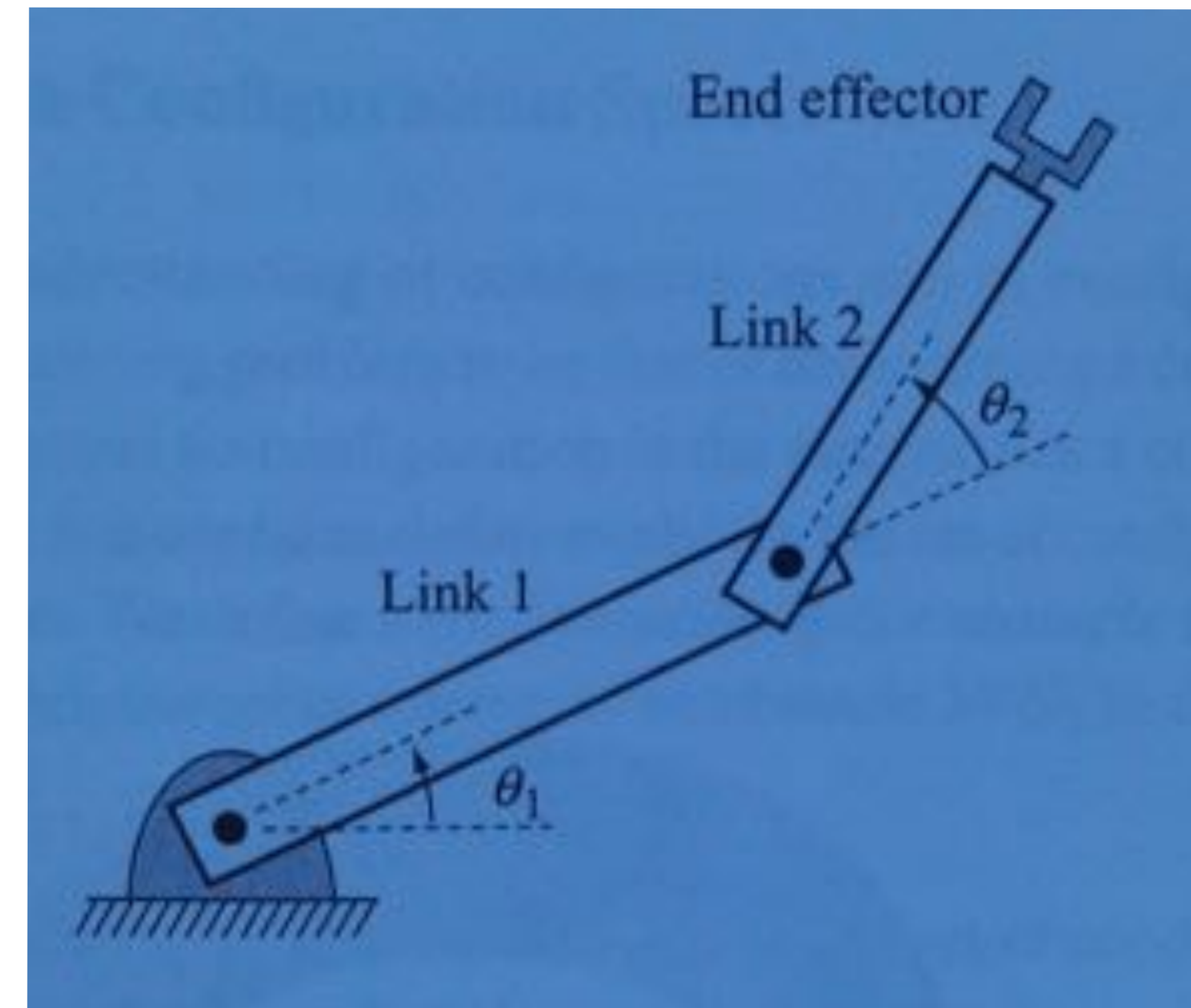
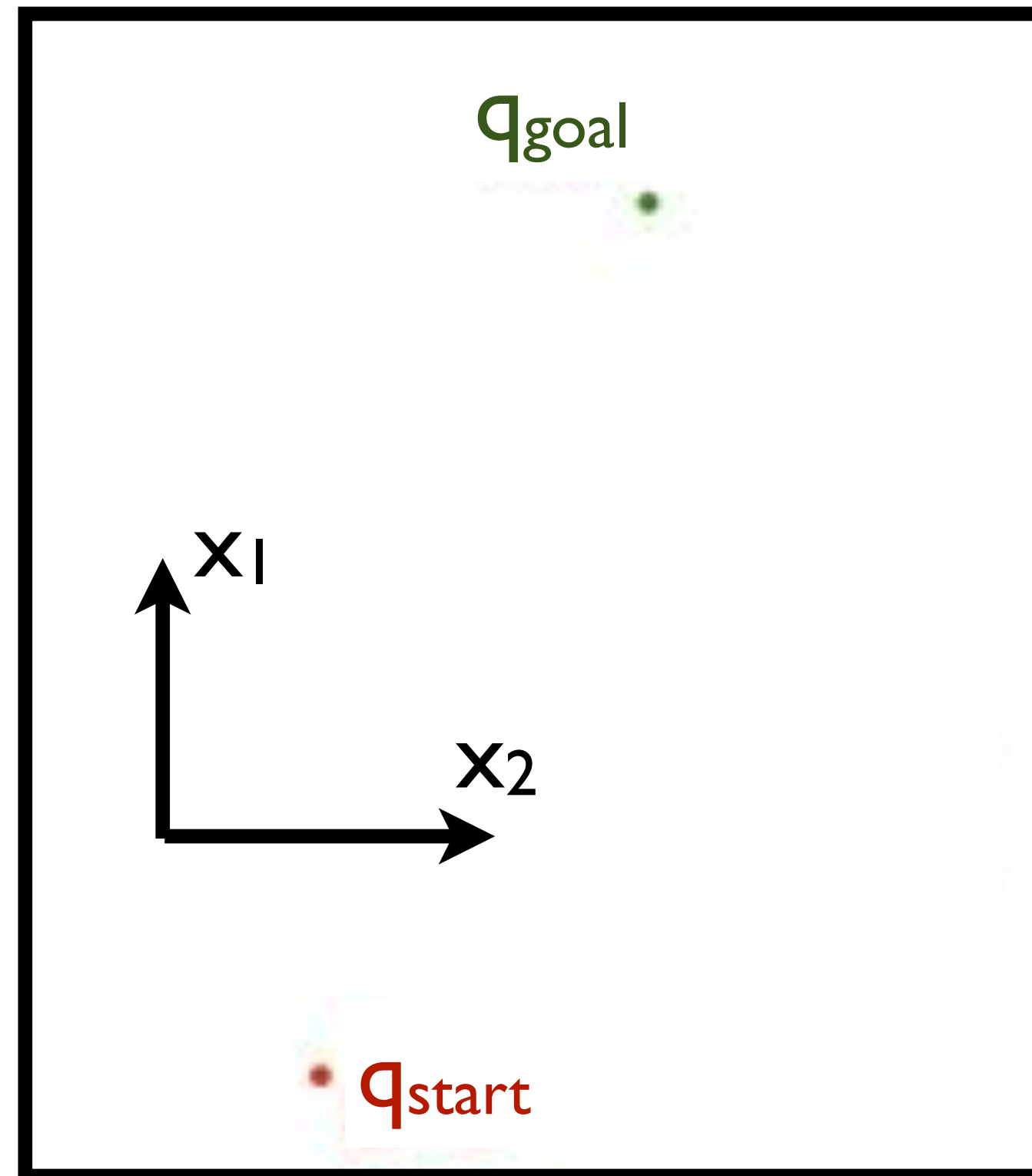


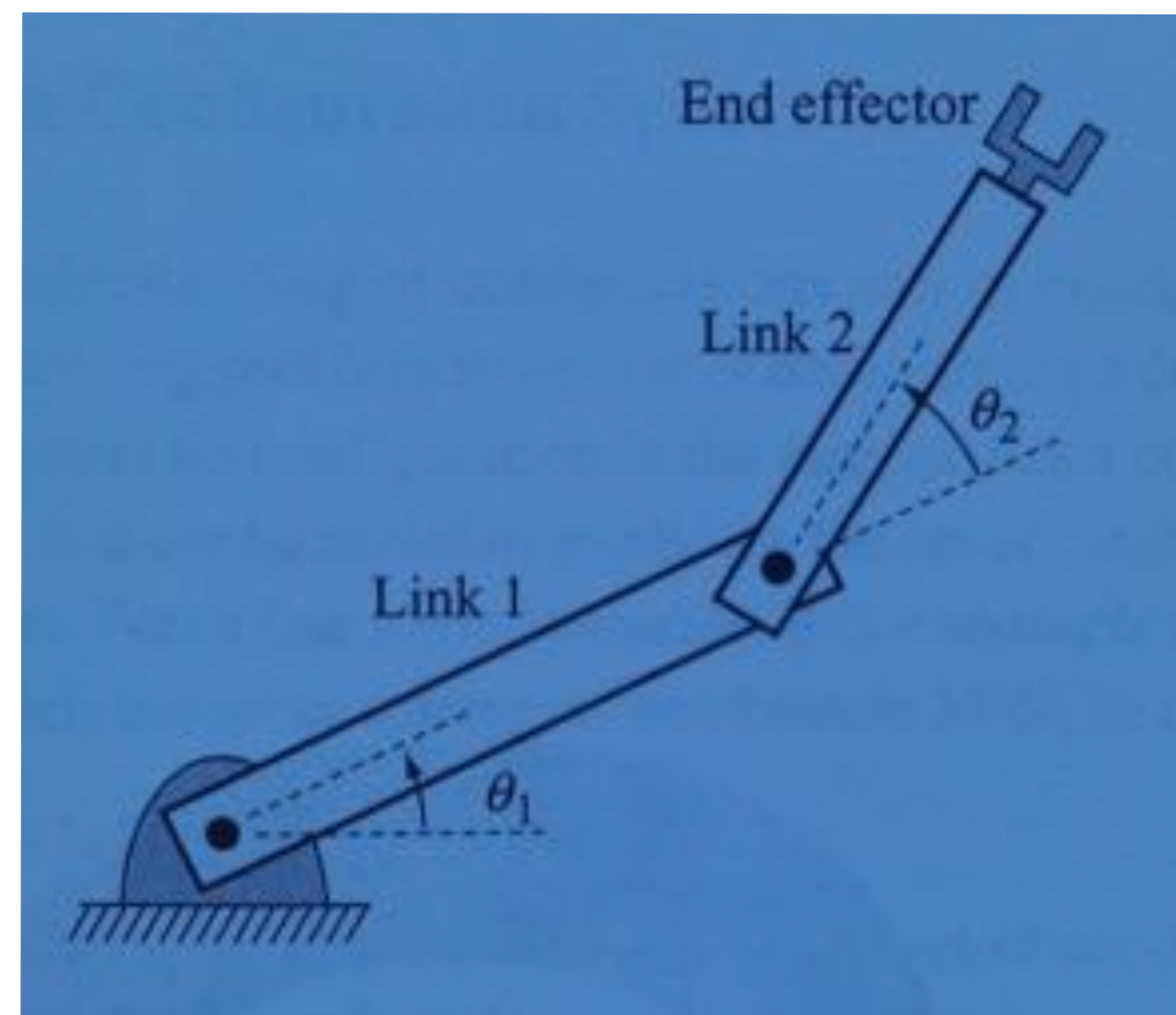
C-space where obstacles are grown with all possible object positions, orientation constrained to 0 degrees



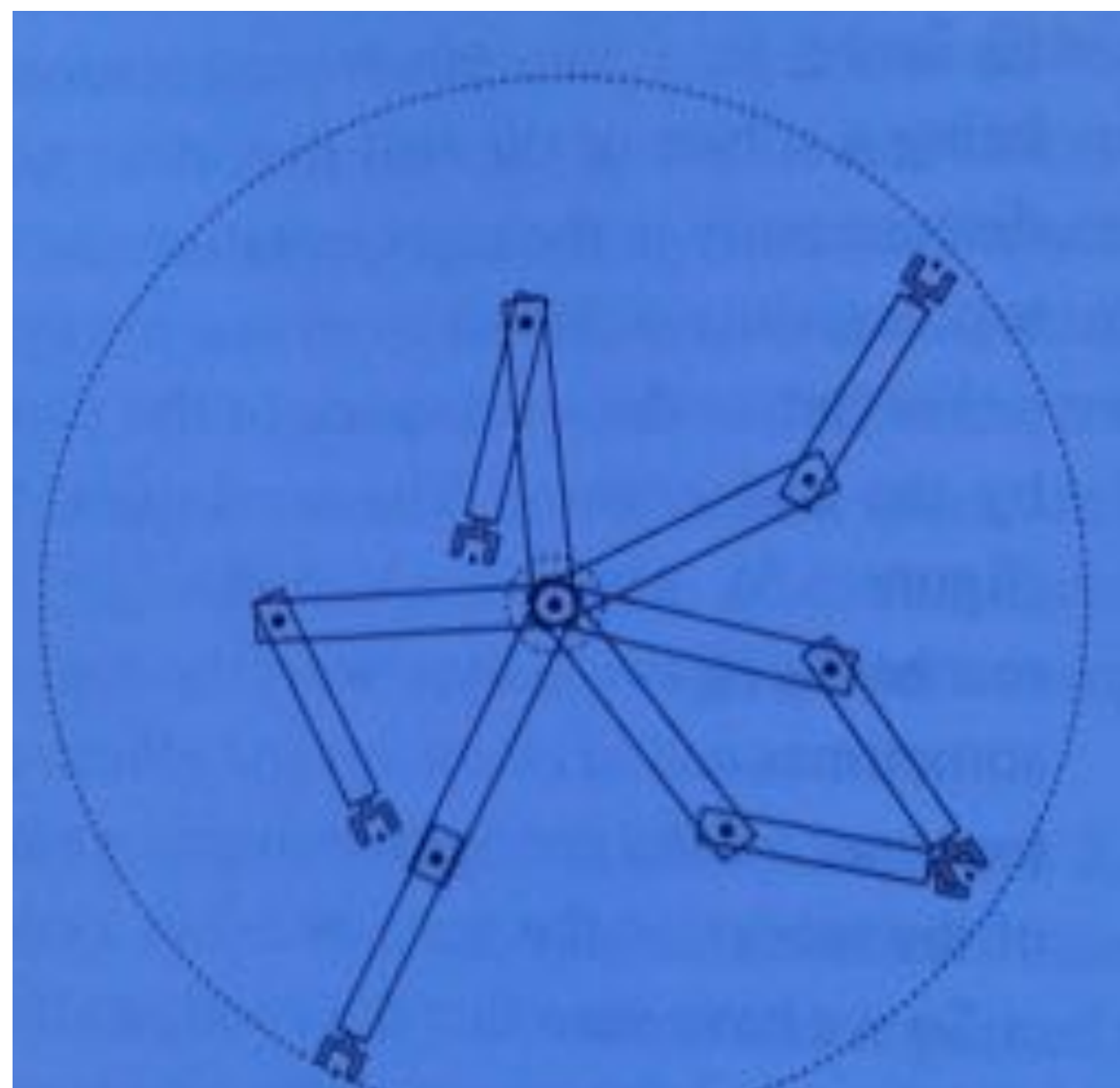
# Configuration v. Workspaces

- Other than rotation and geometry, how is the 2-link arm different than the point robot?





Workspace is w.r.t. end-effector position  $(x,y)$

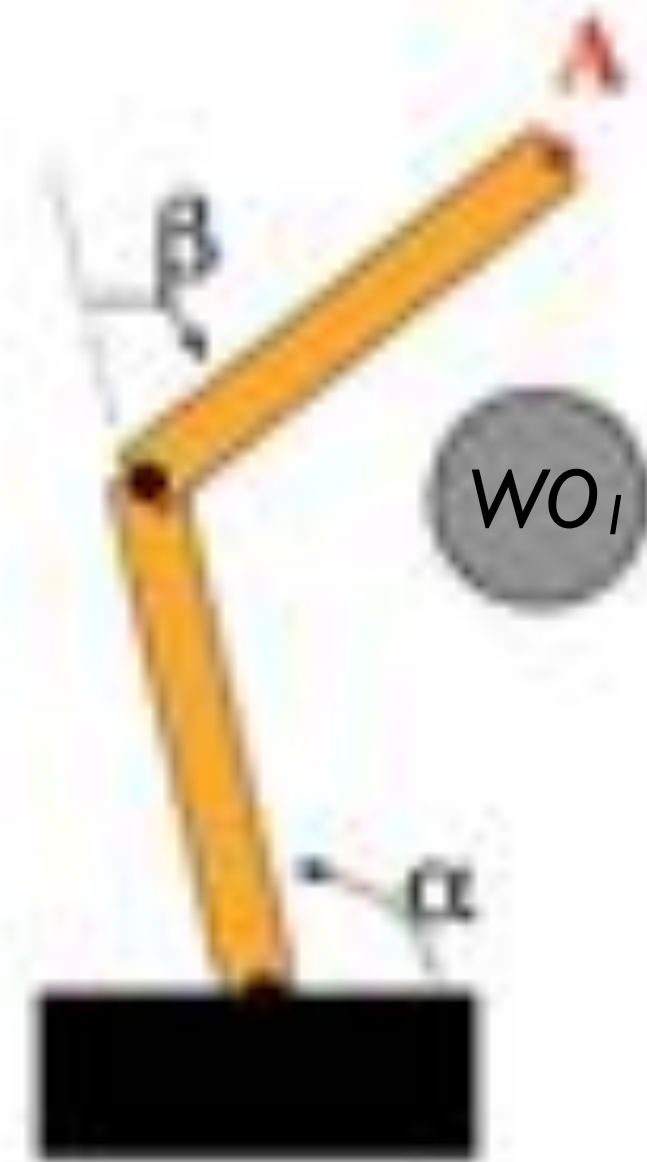


C-space is w.r.t. joint angles  $(\theta_1, \theta_2)$

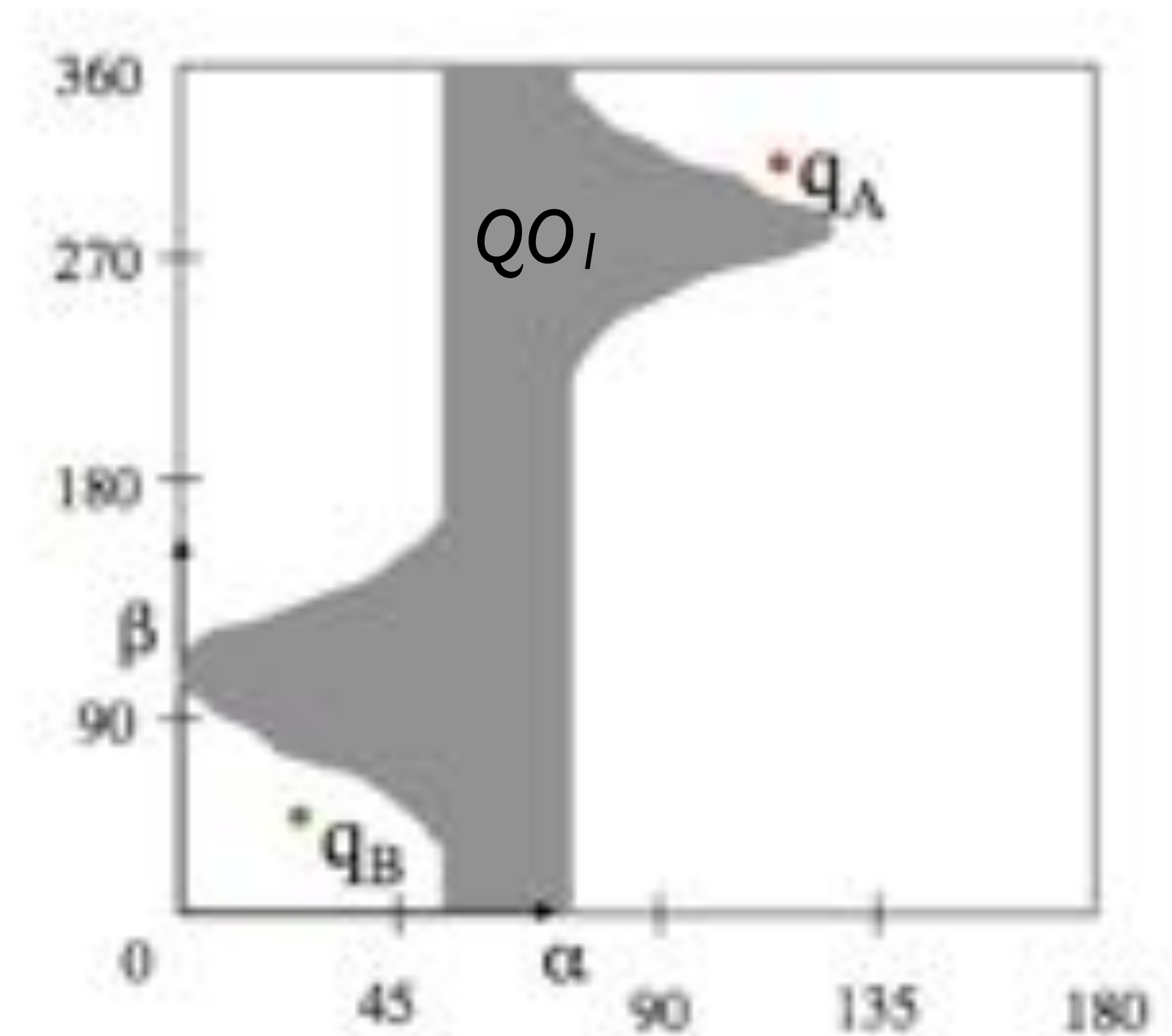




# Obstacles in T<sup>2</sup>

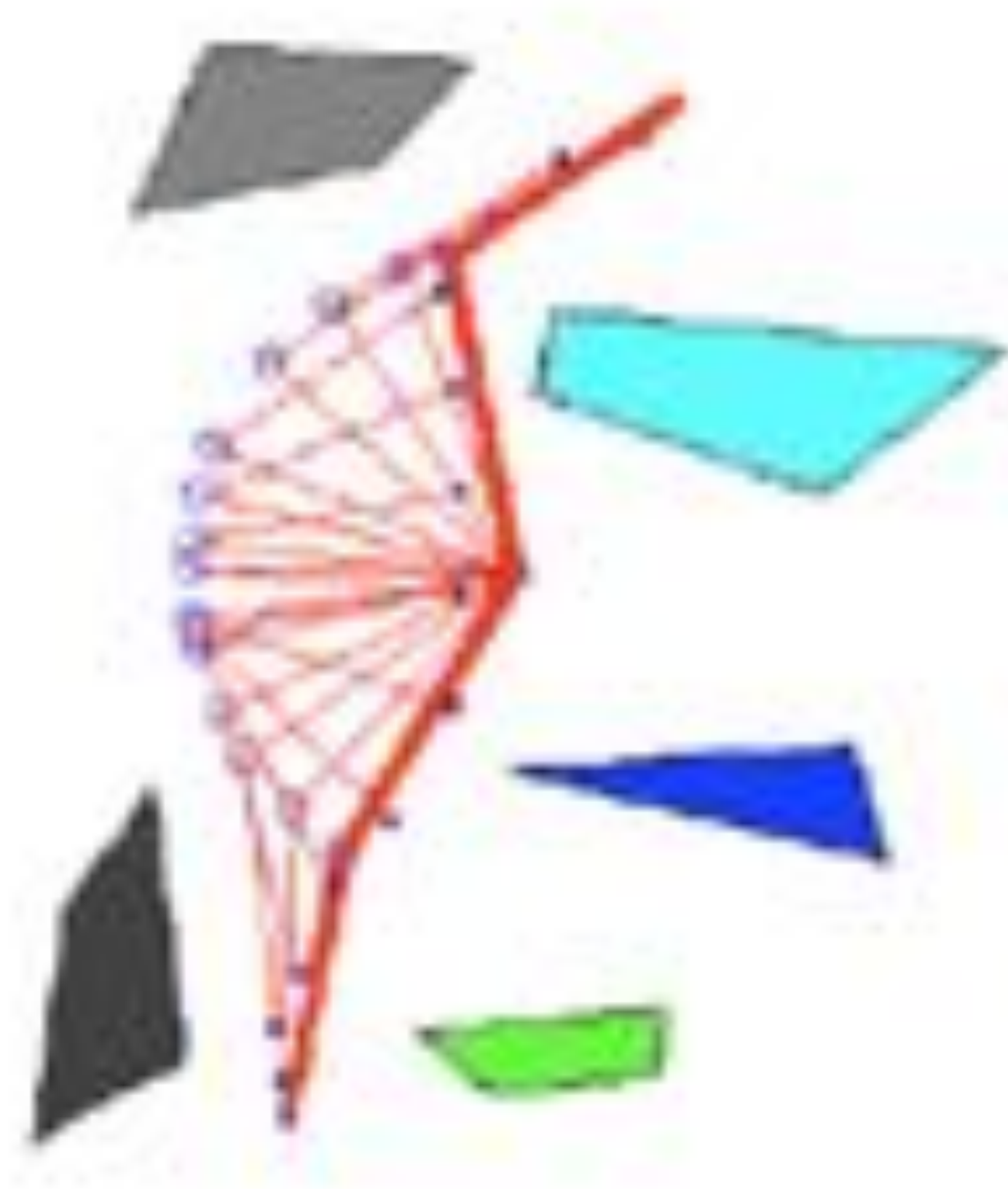


Circular obstacle in workspace

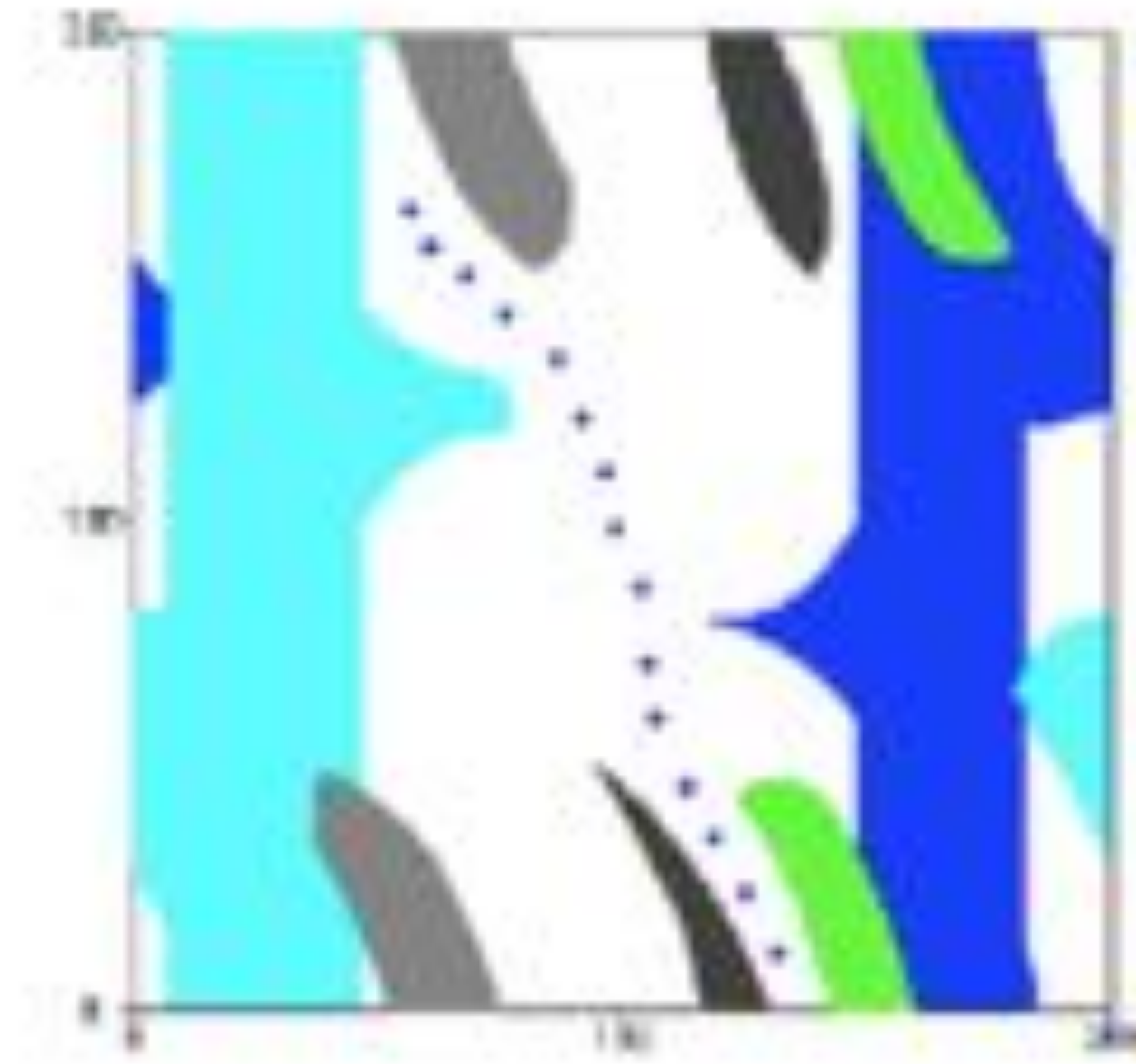


C-space representation

# Path in $T^2$ with several obstacles



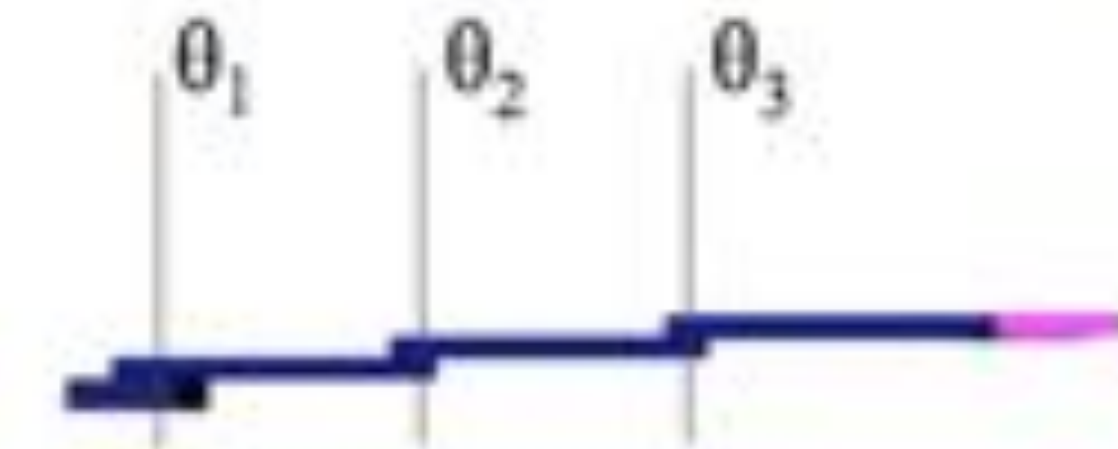
Arm navigation in workspace



C-space representation

# C-space for 3-link arm

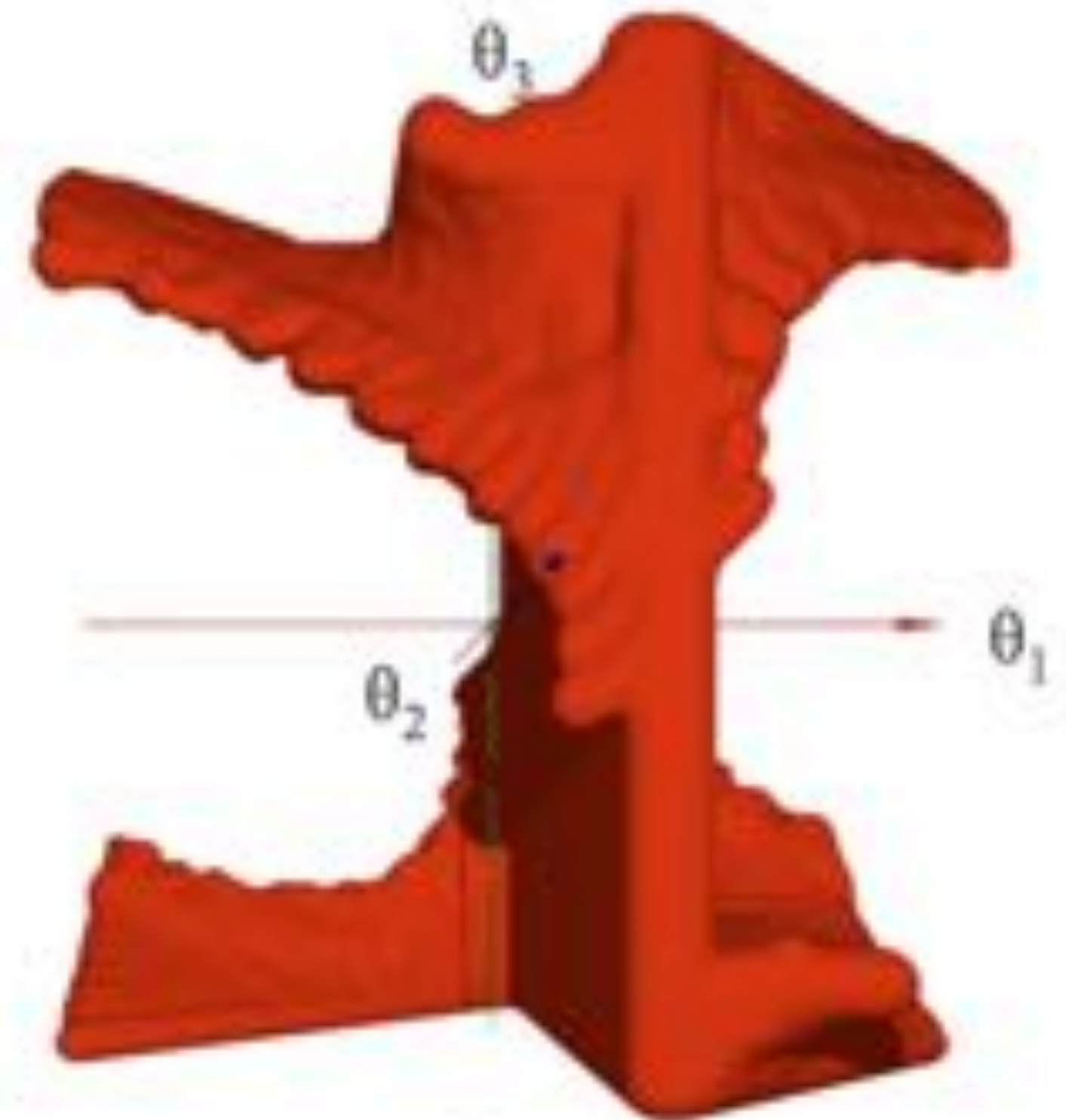
The Configuration Space (C-space)



TOP  
VIEW



workspace



C-space



# Generalizing graph search for robot configurations



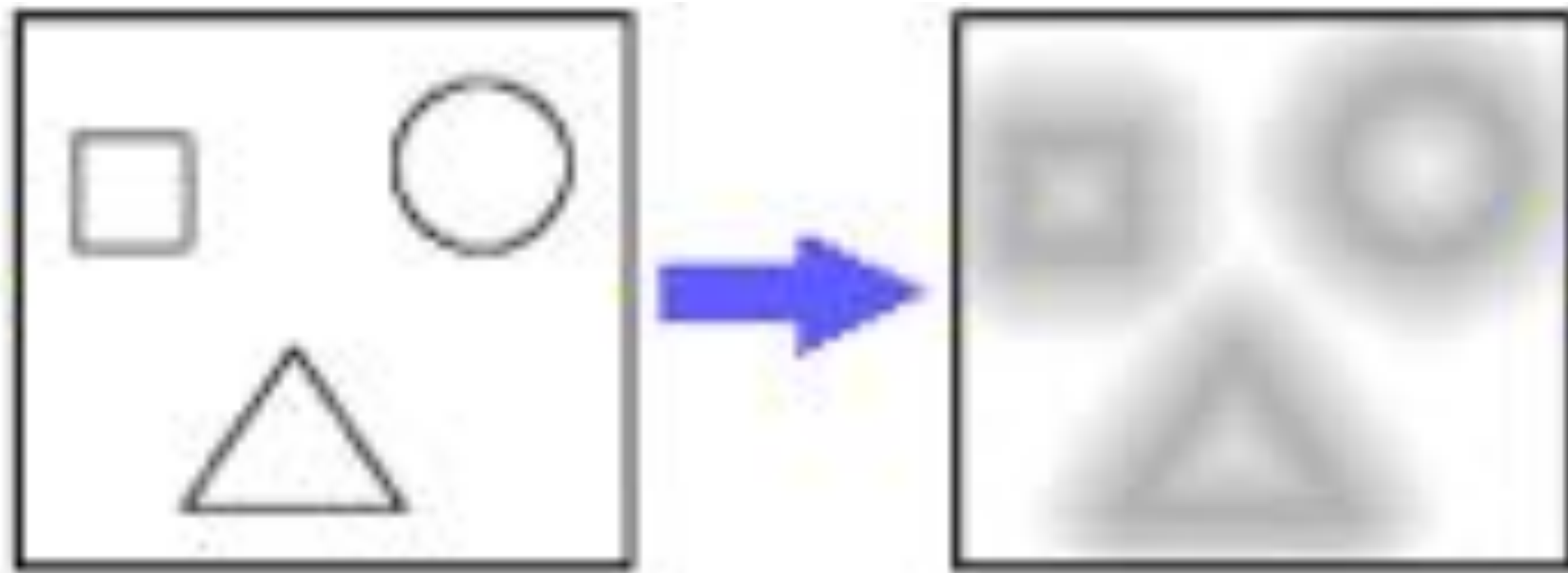
# Costmaps: Graph Search Revisited

- Optimality: Path length vs. Path cost?
- **Costmap** provides weights on graph nodes based on cost factors:
  - Robot motion: joint limits, holonomicity, smoothness
  - Collisions and safety: distance from objects, trajectory predictions
  - Environmental conditions: traversability, slip

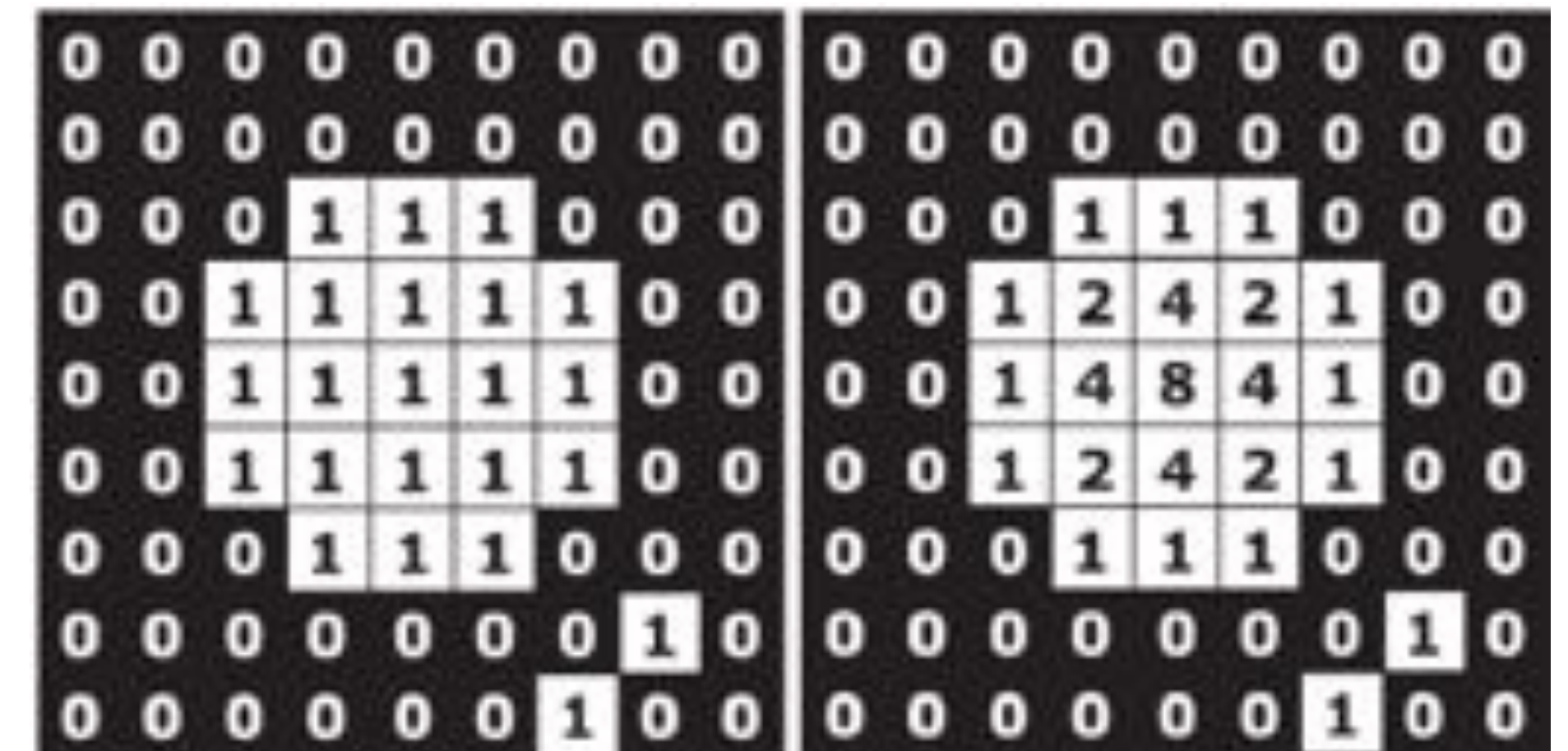


# Distance Transform

Compute distance of each grid cell to nearest obstacle boundary;  
Weight grid cell cost higher if closer to a boundary

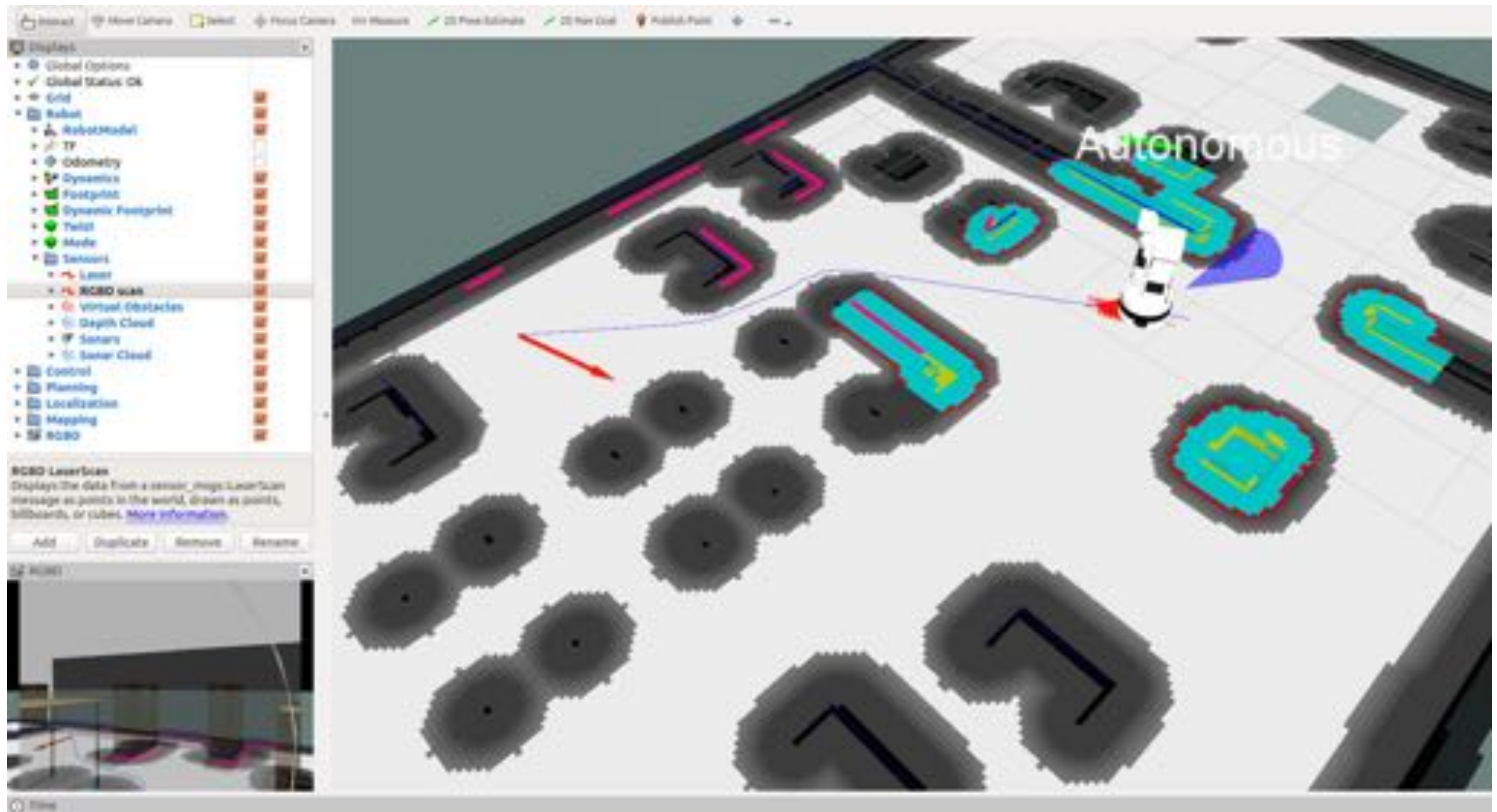


[http://www.gavrila.net/Research/Chamfer\\_System/chamfer\\_basics2.gif](http://www.gavrila.net/Research/Chamfer_System/chamfer_basics2.gif)



Nasonov and Krylov 2010  
(zero indicates obstacle)







## Search algorithm template

all nodes  $\leftarrow \{\text{dist}_{\text{start}} \leftarrow \text{infinity}, \text{parent}_{\text{start}} \leftarrow \text{none}, \text{visited}_{\text{start}} \leftarrow \text{false}\}$

```
start_node ← {dist_start ← 0, parent_start ← none, visited_start ← true}
```

```
visit_list ← start_node
```

```
while visit_list != empty && current_node != goal
```

```
cur_node ← highestPriority(visit_list)
```

```
visitedcur_node ← true
```

```
for each nbr in not_visited(adjacent(cur_node))
```

```
add(nbr to visit_list)
```

**if** dist<sub>nbr</sub> > dist<sub>cur\_node</sub> + distance(nbr,cur\_node)

```
parentnbr ← current_node
```

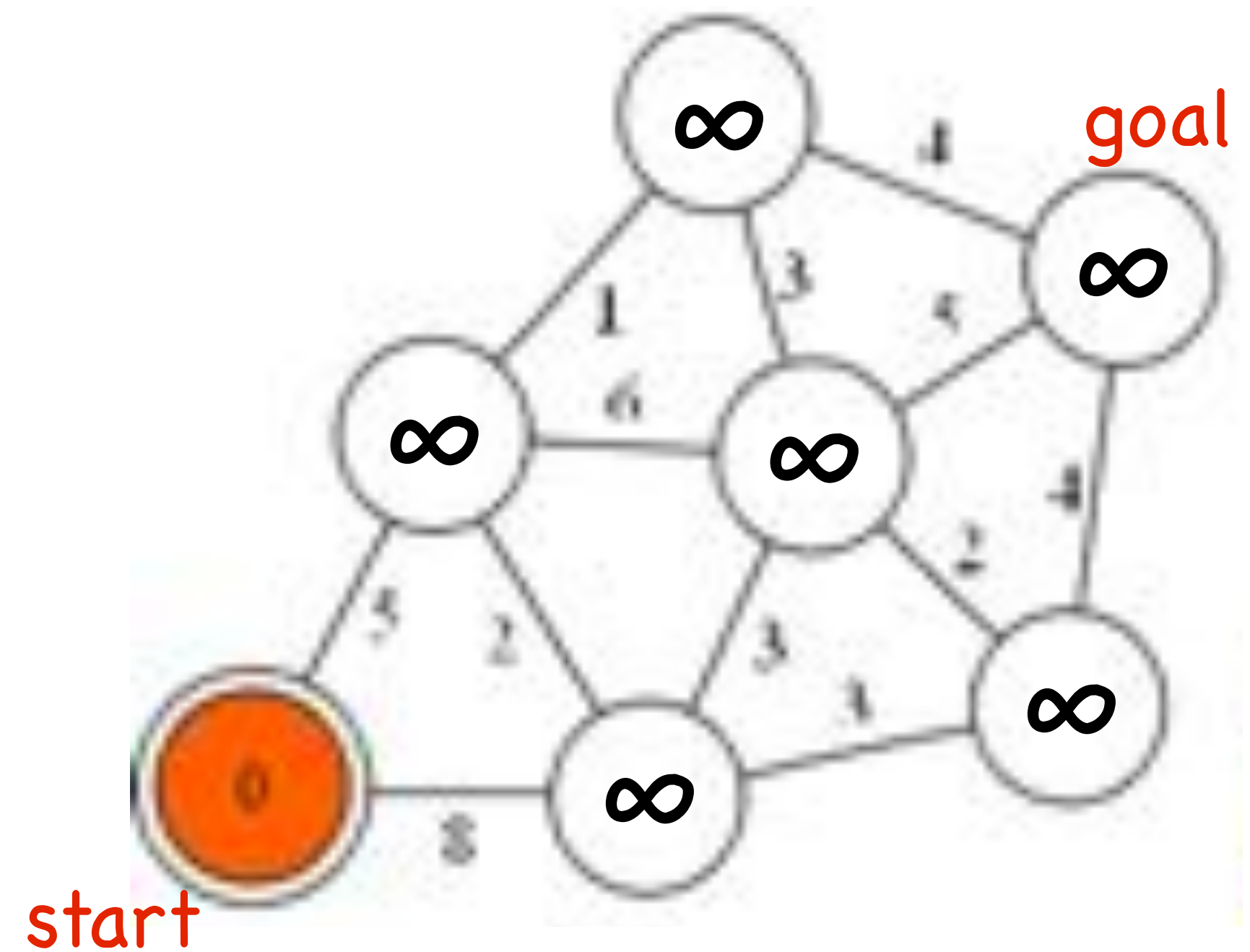
```
dist_nbr ← dist_cur_node + distance(nbr,cur_node)
```

**end if**

**end for loop**

**end while loop**

output  $\leftarrow$  parent, distance



## Search algorithm template

all nodes  $\leftarrow \{\text{cost}_{\text{start}} \leftarrow \text{infinity}, \text{parent}_{\text{start}} \leftarrow \text{none}, \text{visited}_{\text{start}} \leftarrow \text{false}\}$

start\_node  $\leftarrow \{\text{cost}_{\text{start}} \leftarrow 0, \text{parent}_{\text{start}} \leftarrow \text{none}, \text{visited}_{\text{start}} \leftarrow \text{true}\}$

visit\_list  $\leftarrow \text{start\_node}$

**while** visit\_list  $\neq$  empty && current\_node  $\neq$  goal

    cur\_node  $\leftarrow \text{highestPriority}(\text{visit\_list})$

    visited<sub>cur\_node</sub>  $\leftarrow$  true

**for** each nbr in not\_visited(adjacent(cur\_node))

        add(nbr to visit\_list)

**if** cost<sub>nbr</sub>  $>$  cost<sub>cur\_node</sub> + cost(nbr)

            parent<sub>nbr</sub>  $\leftarrow$  current\_node

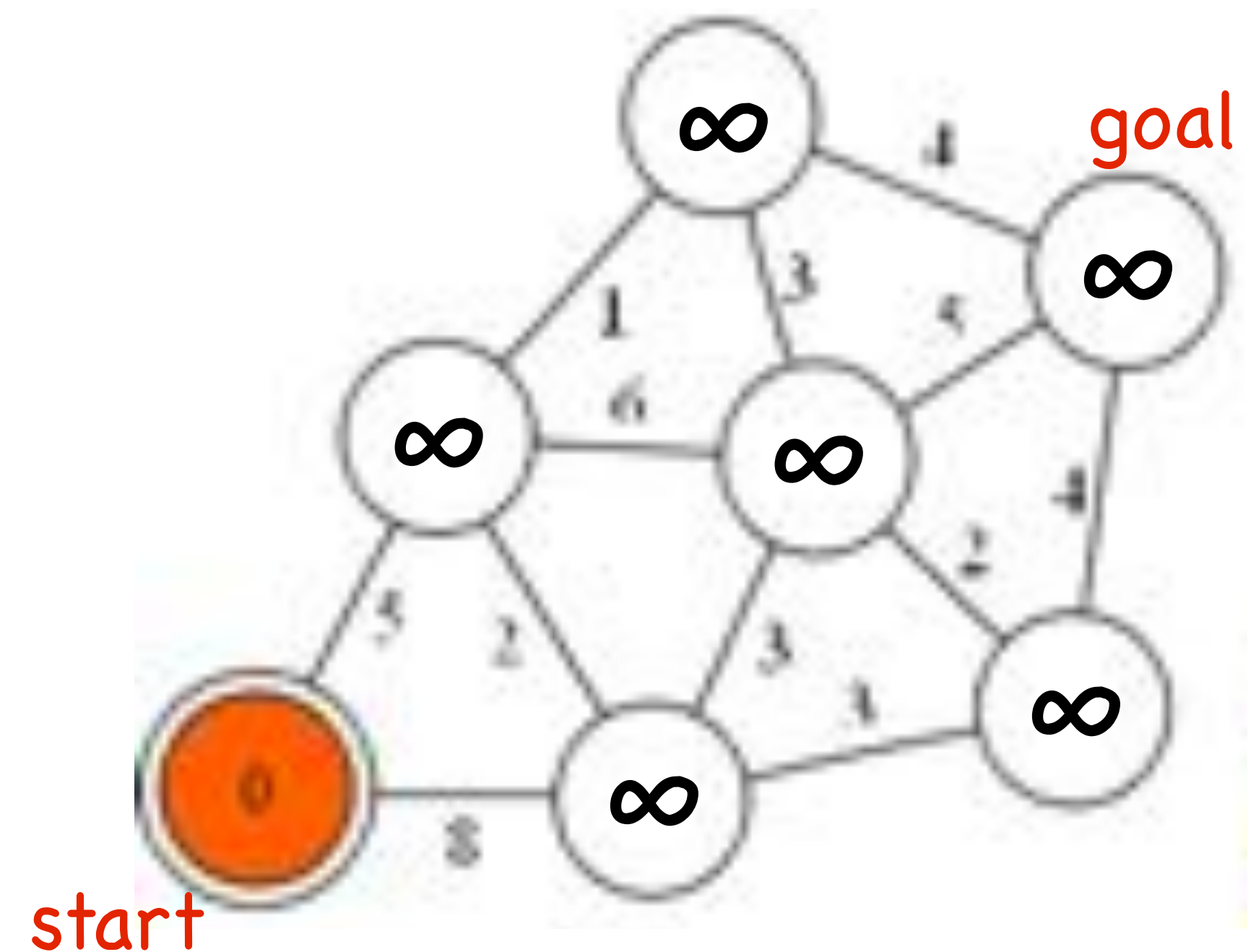
            cost<sub>nbr</sub>  $\leftarrow$  cost<sub>cur\_node</sub> + cost(nbr)

**end if**

**end for** loop

**end while** loop

output  $\leftarrow$  parent, distance





## A-star shortest path algorithm

all nodes  $\leftarrow \{\text{cost}_{\text{start}} \leftarrow \text{infinity}, \text{parent}_{\text{start}} \leftarrow \text{none}, \text{visited}_{\text{start}} \leftarrow \text{false}\}$

start\_node  $\leftarrow \{\text{cost}_{\text{start}} \leftarrow 0, \text{parent}_{\text{start}} \leftarrow \text{none}, \text{visited}_{\text{start}} \leftarrow \text{true}\}$

visit\_queue  $\leftarrow \text{start\_node}$

**while** (visit\_queue  $\neq$  empty) && current\_node  $\neq$  goal

  dequeue: cur\_node  $\leftarrow \text{f\_score}(\text{visit\_queue})$

  visited<sub>cur\_node</sub>  $\leftarrow$  true

**for** each nbr in not\_visited(adjacent(cur\_node))

    enqueue: nbr to visit\_queue

**if** cost<sub>nbr</sub> > cost<sub>cur\_node</sub> + cost(nbr)

      parent<sub>nbr</sub>  $\leftarrow$  current\_node

      cost<sub>nbr</sub>  $\leftarrow$  cost<sub>cur\_node</sub> + cost(nbr)

      f\_score  $\leftarrow$  cost<sub>nbr</sub> + line\_distance<sub>nbr,goal</sub>

**end if**

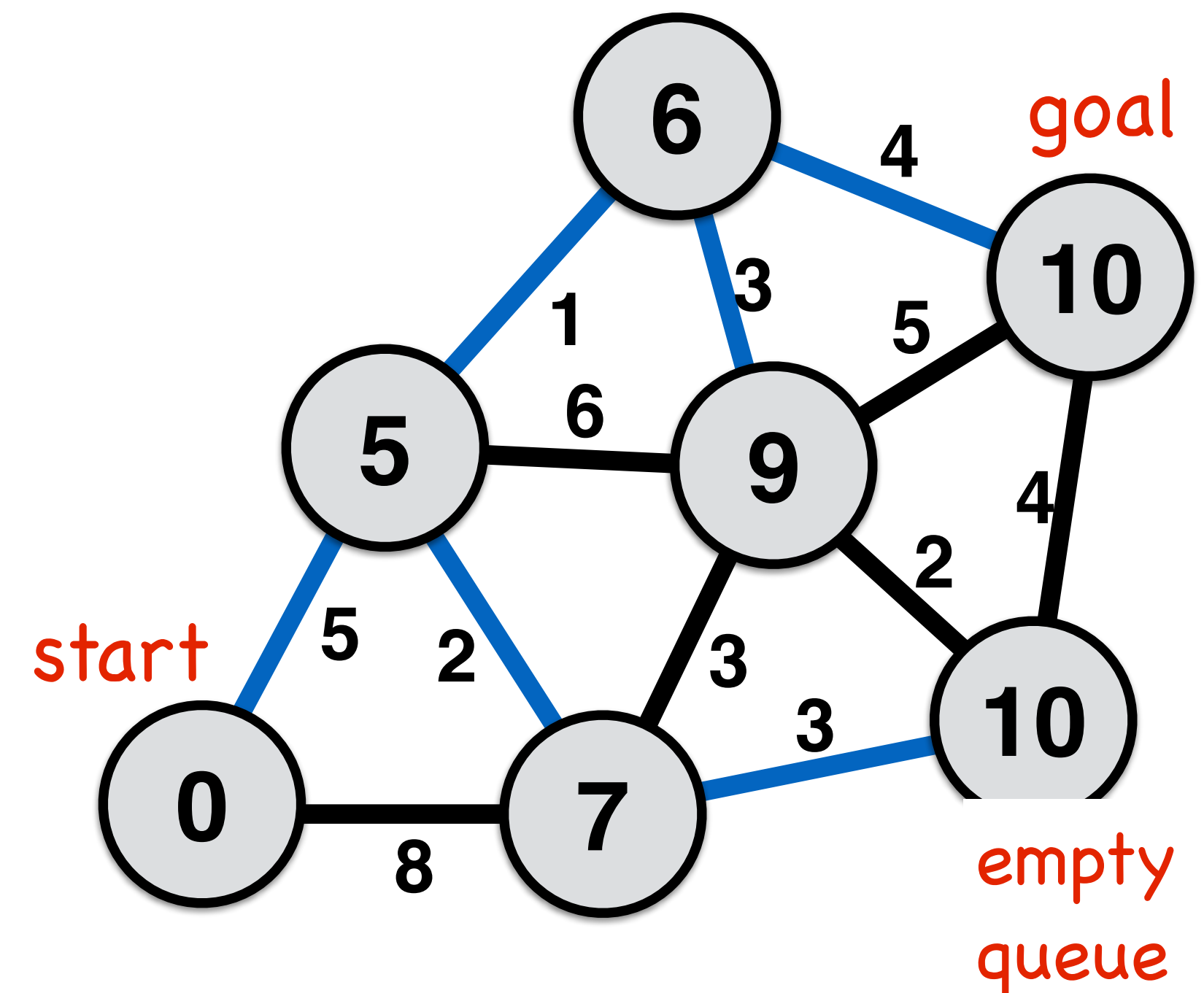
**end for loop**

**end while loop**

output  $\leftarrow$  parent, distance

↑  
g\_score:  
cost from start

↑  
h\_score:  
optimistic cost to goal



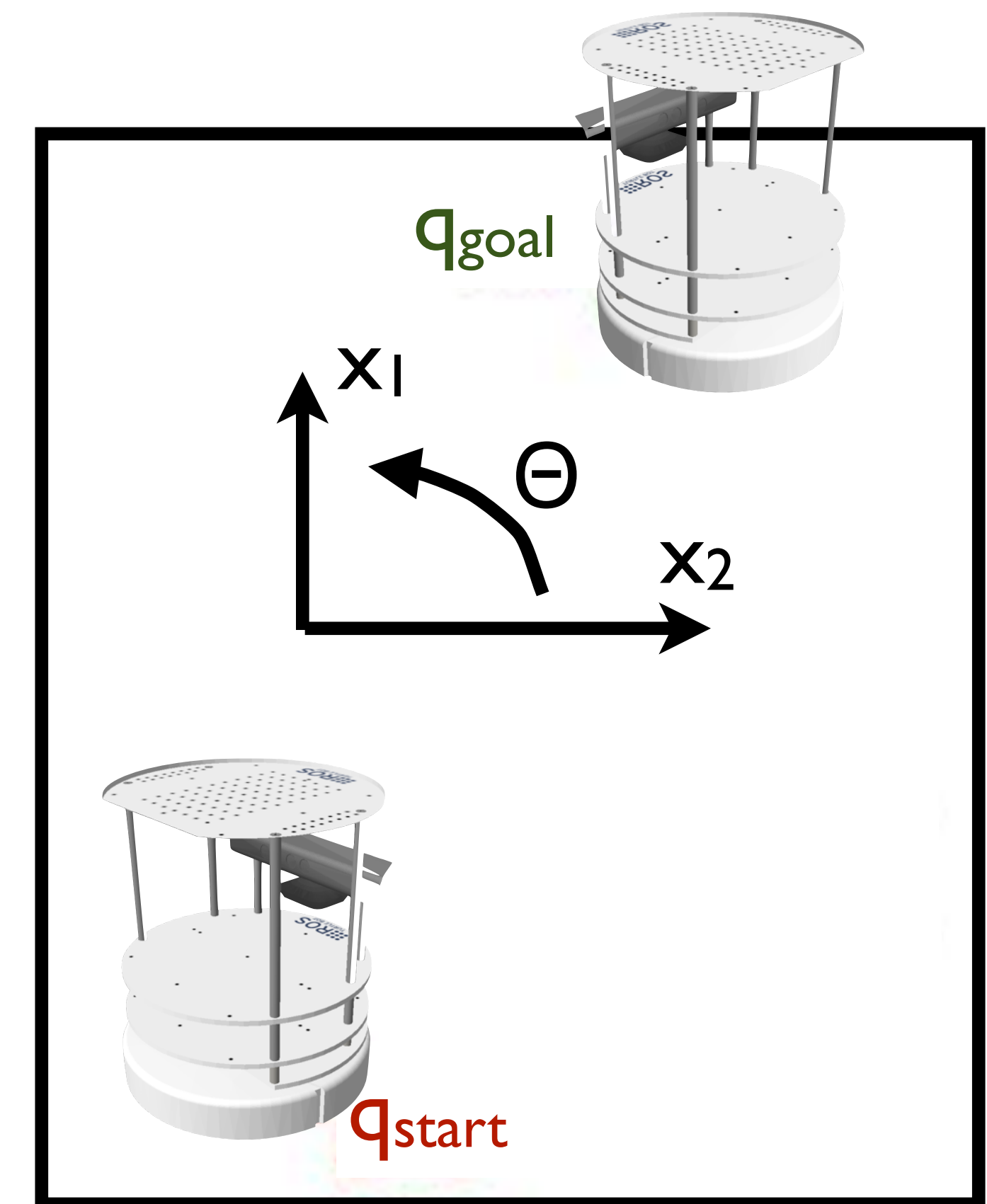
Can a robot move in any  
direction instantaneously?



# Holonomicity

- Does the Turtlebot have 2 DOFs, instead of 3?
- The Turtlebot can only move along 2 axes
  - linear: forward/backward
  - angular: turning

Turtlebot is nonholonomic





# Holonomicity



<https://www.youtube.com/watch?v=c-IEjVsoiGo>



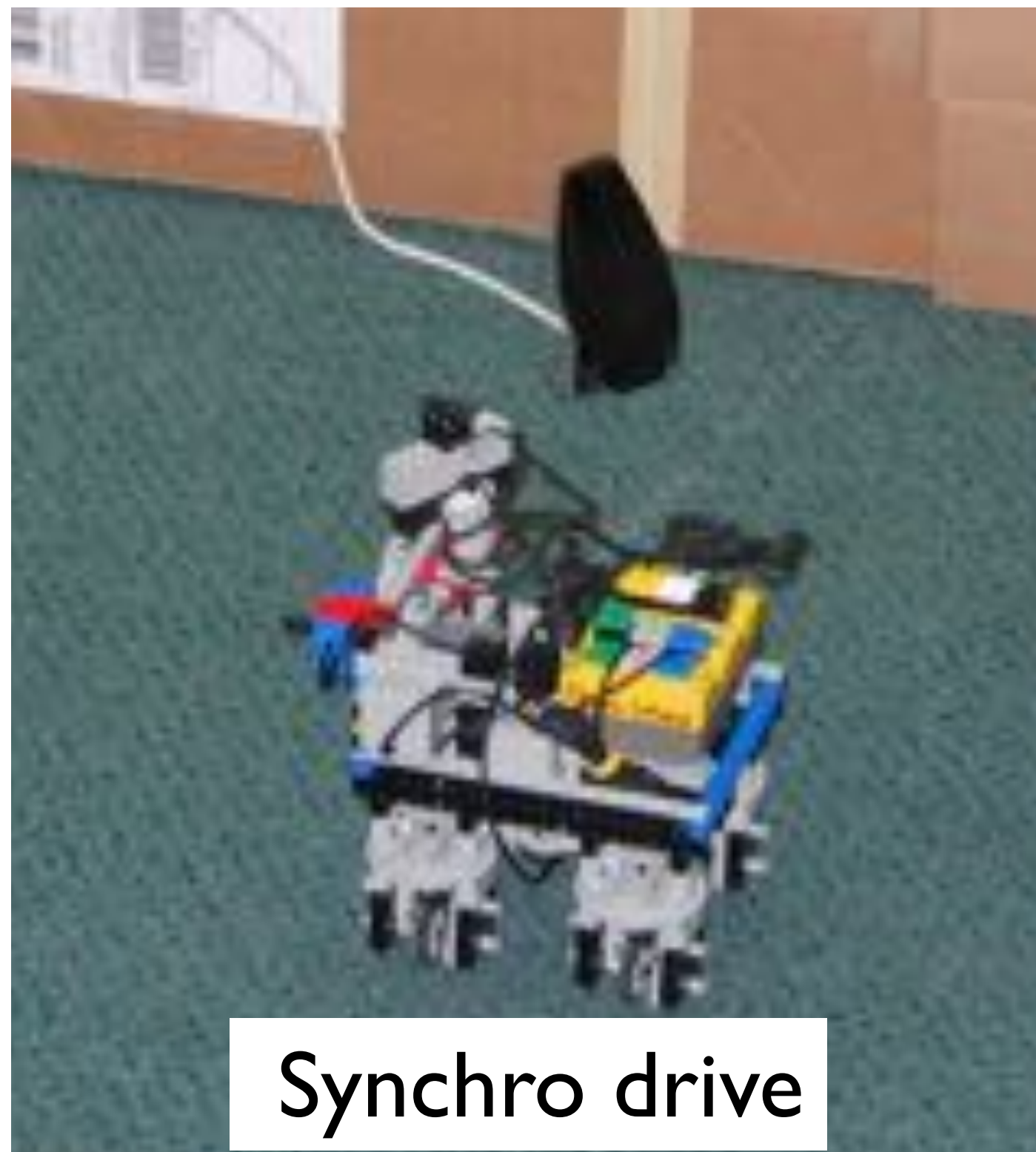
<https://www.youtube.com/watch?v=1ak17mdRg5I&t=75s>

- A robot is holonomic if it can change its pose instantaneously to move in all directions
- Otherwise, the robot is nonholonomic



# Holonomic mobile robot systems

Omni-wheel drive



Synchro drive

E. Leland, Segway, robotthoughts.com



Mecanum wheels



Killough platform



# Synchro Drive



markclego, <https://www.youtube.com/watch?v=THdu6QD8Roc>





# KUKA YouBot with Mecanum wheels



Me teleoperating KUKA YouBot from my house via a web browser, [http://youtu.be/sVrRiy0AM\\_w](http://youtu.be/sVrRiy0AM_w)





# DJI Robomaster Racing

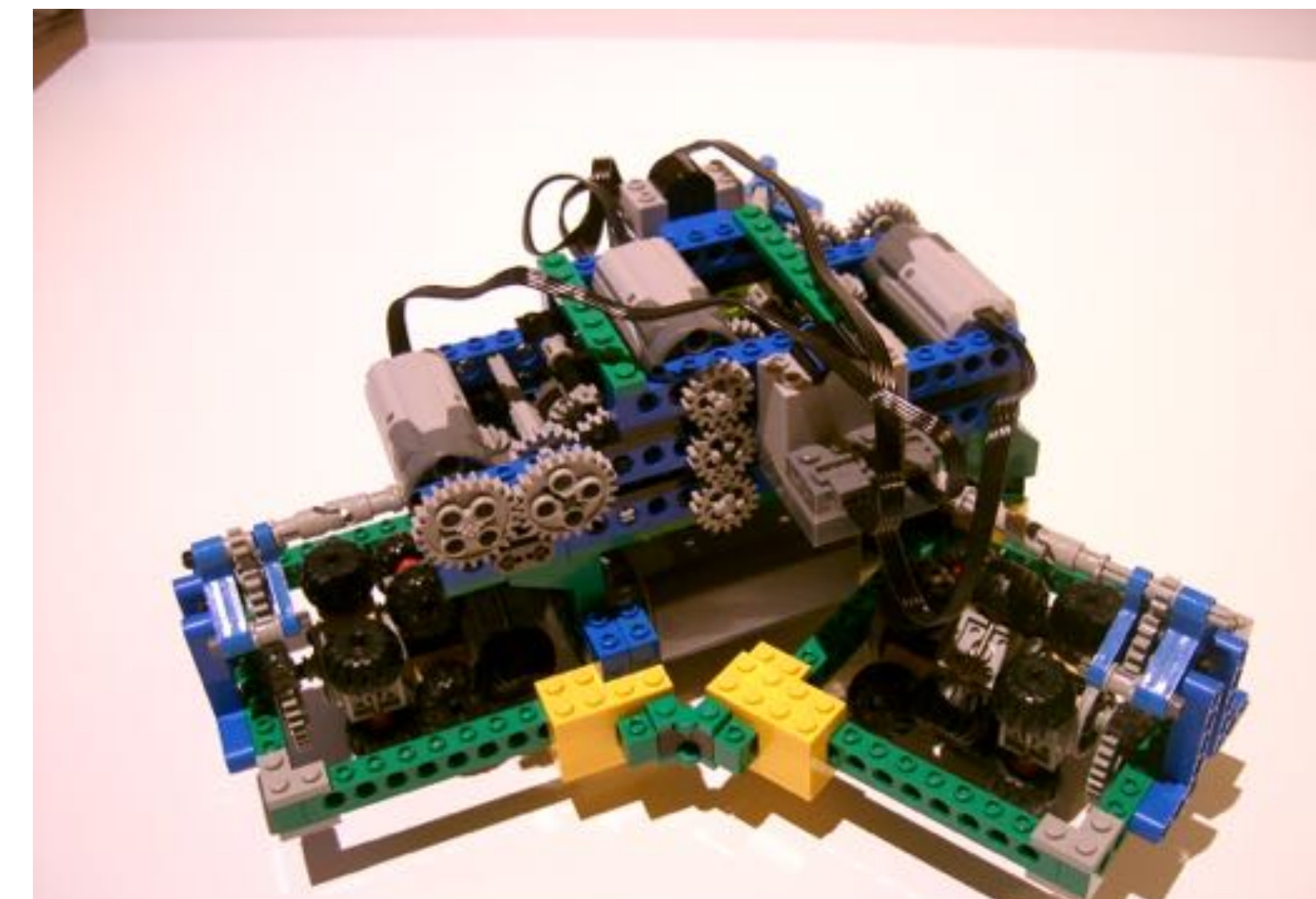


Japan Times, <https://www.youtube.com/watch?v=52skH4Npnvl>





# Killough platform



robotthoughts.com; [http://technicbricks.blogspot.com/2008/08/going-to-all-places-in-all-directions\\_29.html](http://technicbricks.blogspot.com/2008/08/going-to-all-places-in-all-directions_29.html)

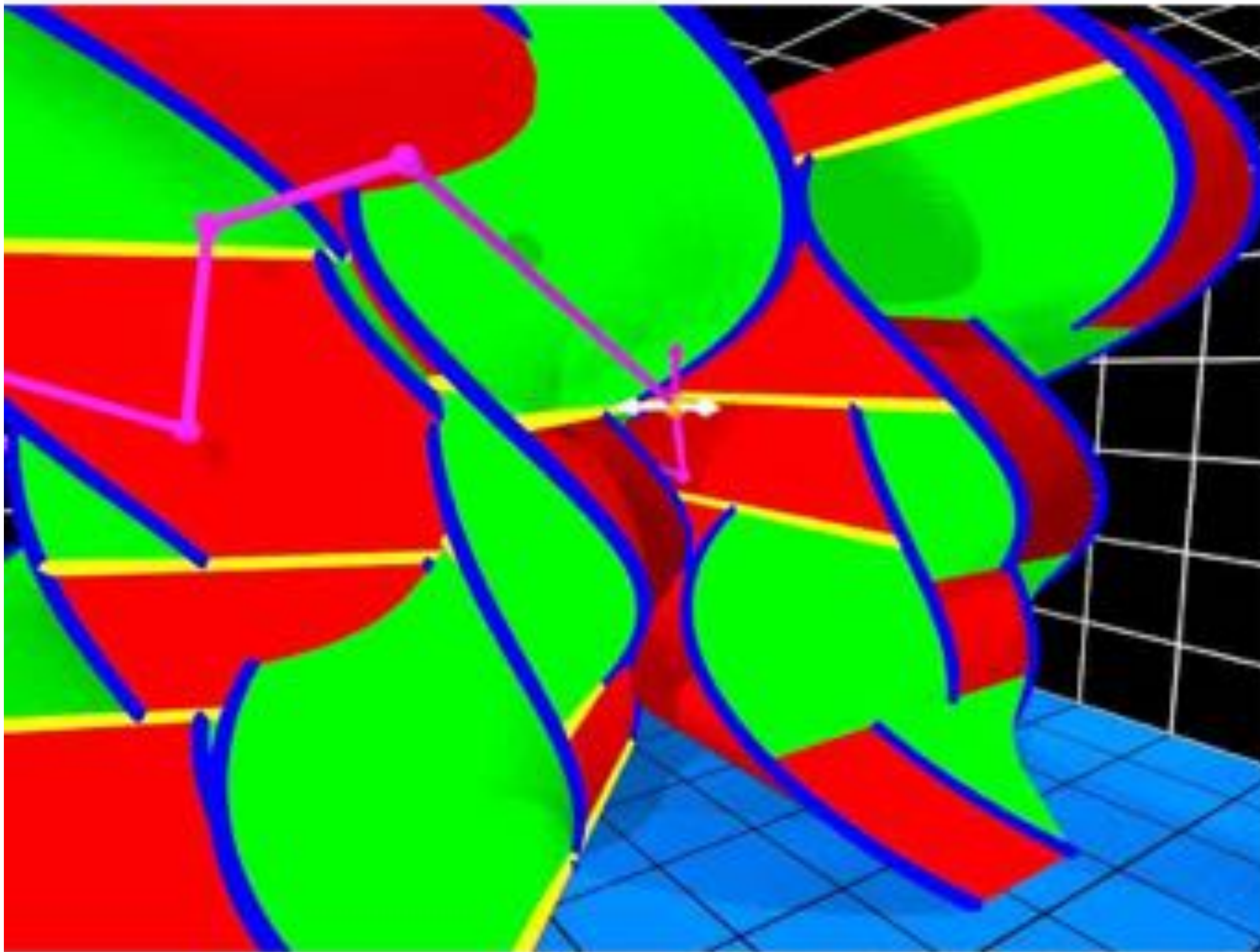


# Recommended: D'Andrea on Omni-drive



[https://www.youtube.com/watch?v=p\\_WI-C-ORso](https://www.youtube.com/watch?v=p_WI-C-ORso)

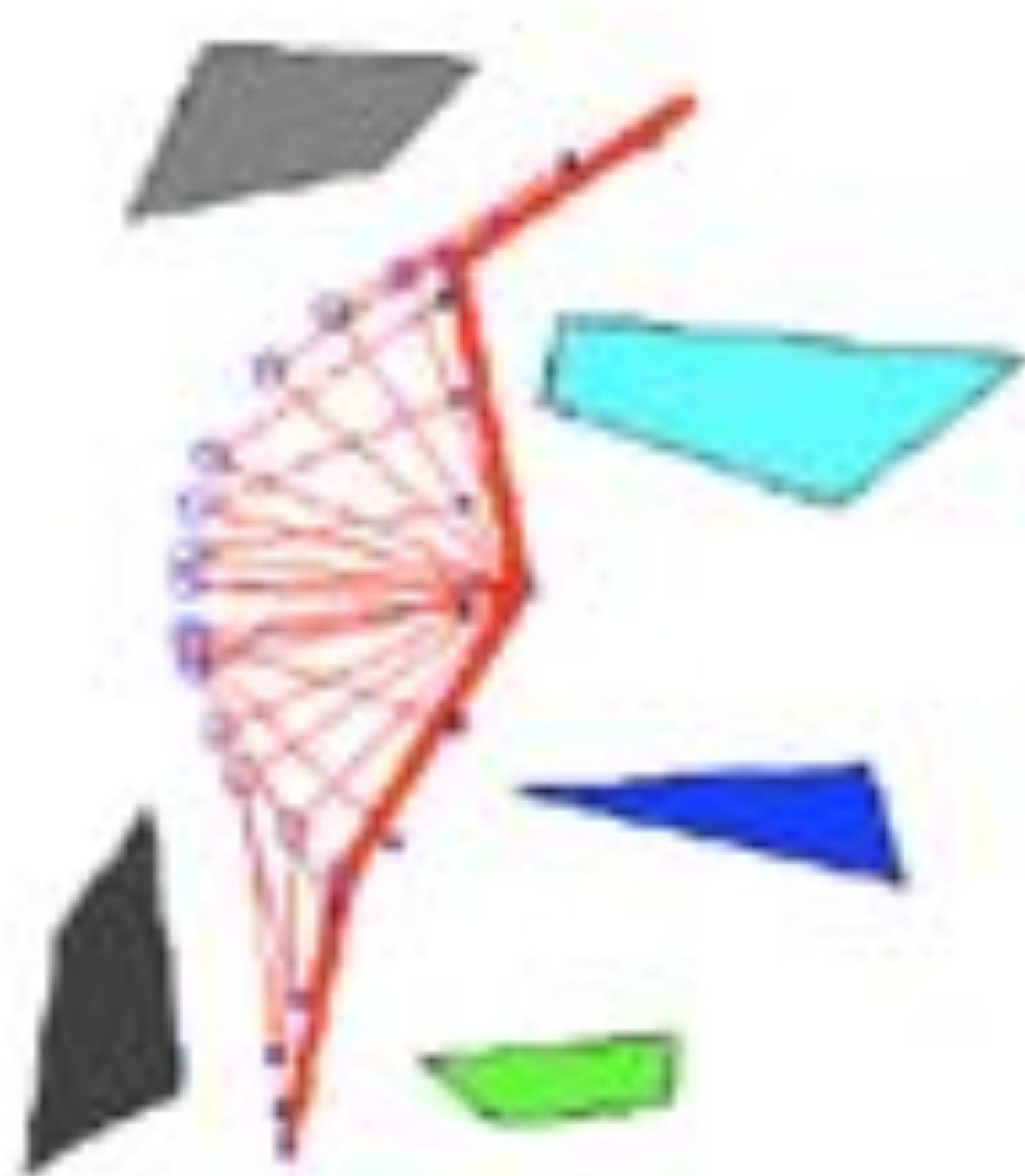




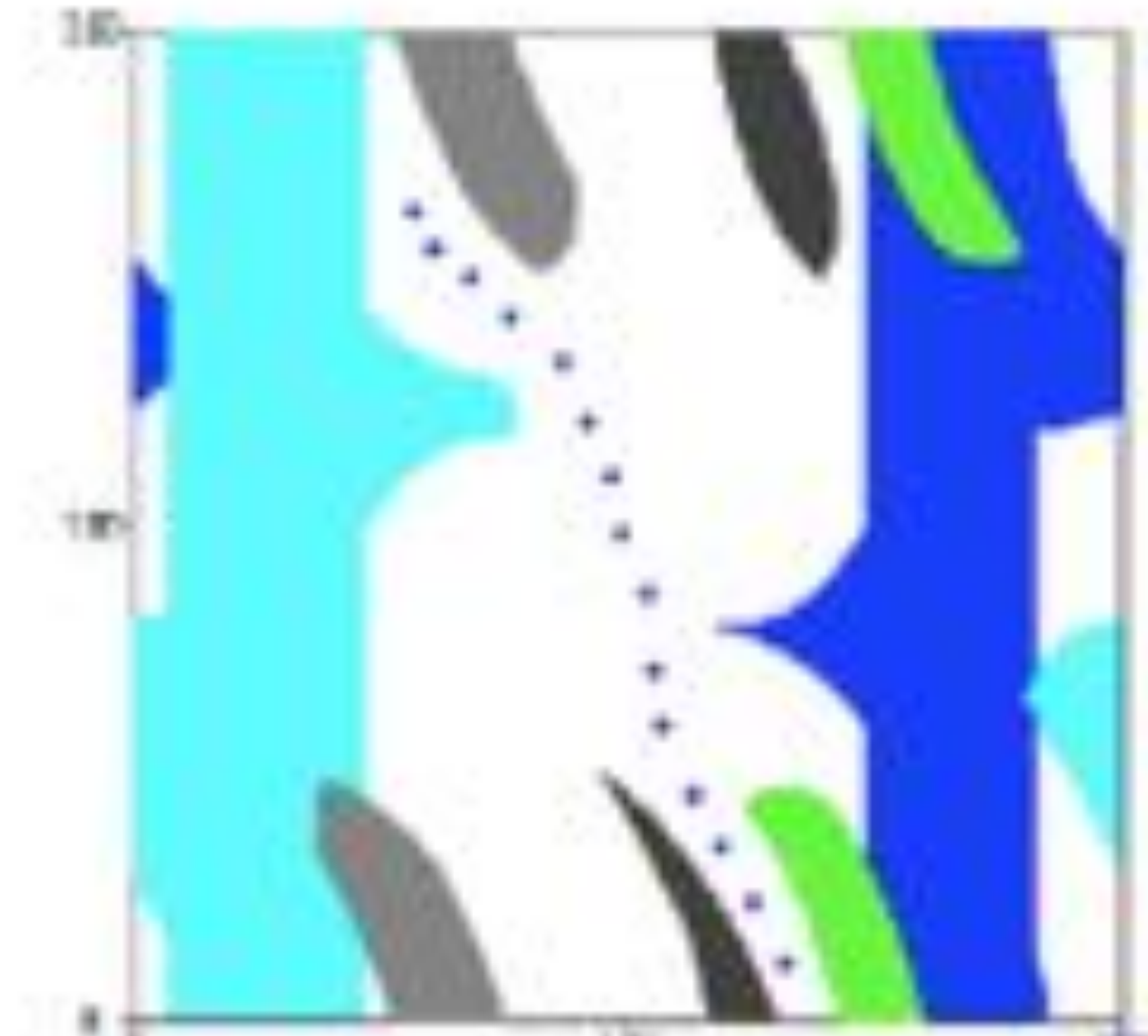
Visualization developed by Dror Atariah and Günter Rote - <https://www.youtube.com/watch?v=SBFwgR4K1Gk>



# How do we search arbitrary C-spaces?



Arm navigation in workspace



C-space representation

# How build graphs in arbitrary C-spaces?



# Next Lecture

## Planning - IV - Sampling-based Planning

