



# Constrained Bimanual Planning with Analytic Inverse Kinematics

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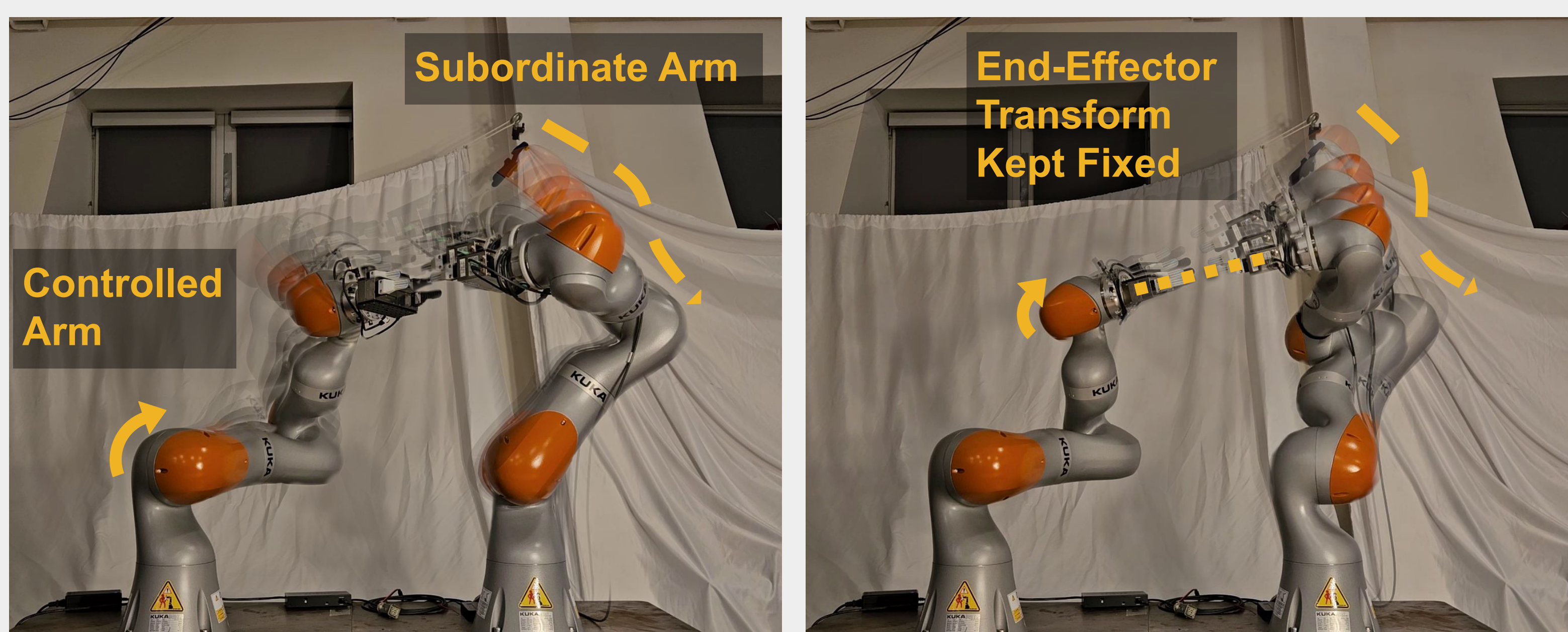


We present a minimal coordinates parametrization for bimanual manipulators with relative end-effector pose constraints, such as when the two hands are manipulating a rigid object.

## Why Use this Parametrization?

- Automatically satisfy kinematic constraints
- Works with any planning method
- No nonlinear equality constraints
- Differentiate through the IK mapping to use trajopt

## Parametrization

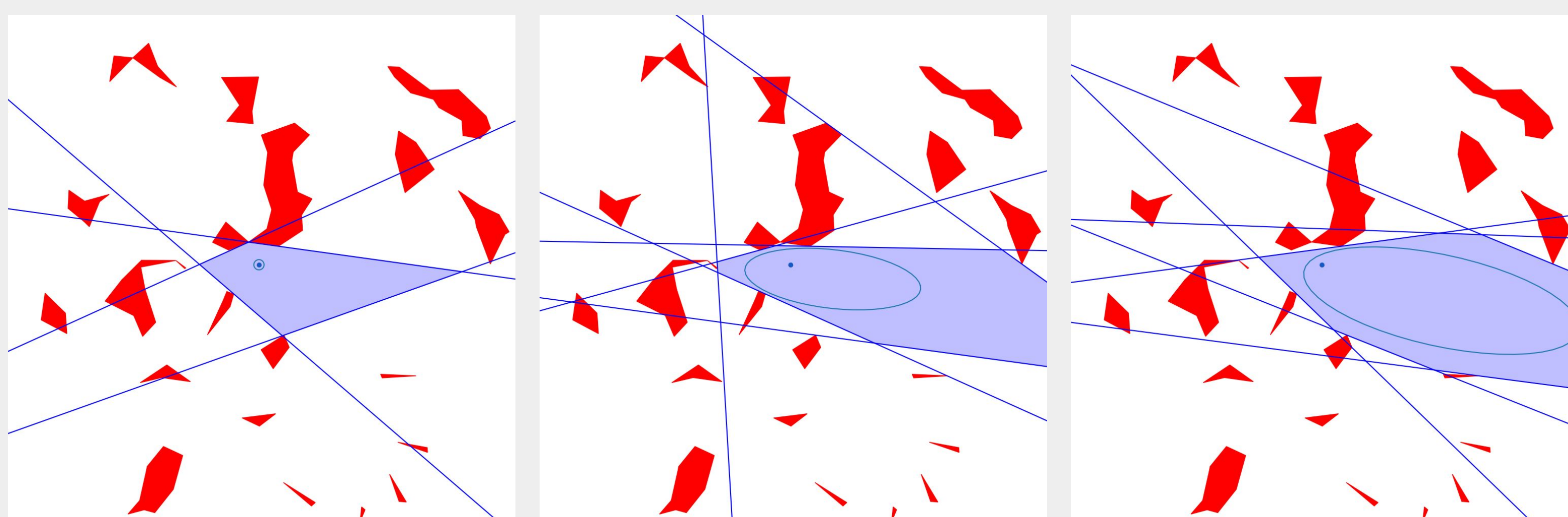


Planning is done in the configuration space of the joints of the *controlled arm* and the continuous redundancy parameter of an analytic IK solution applied to the *subordinate arm*.

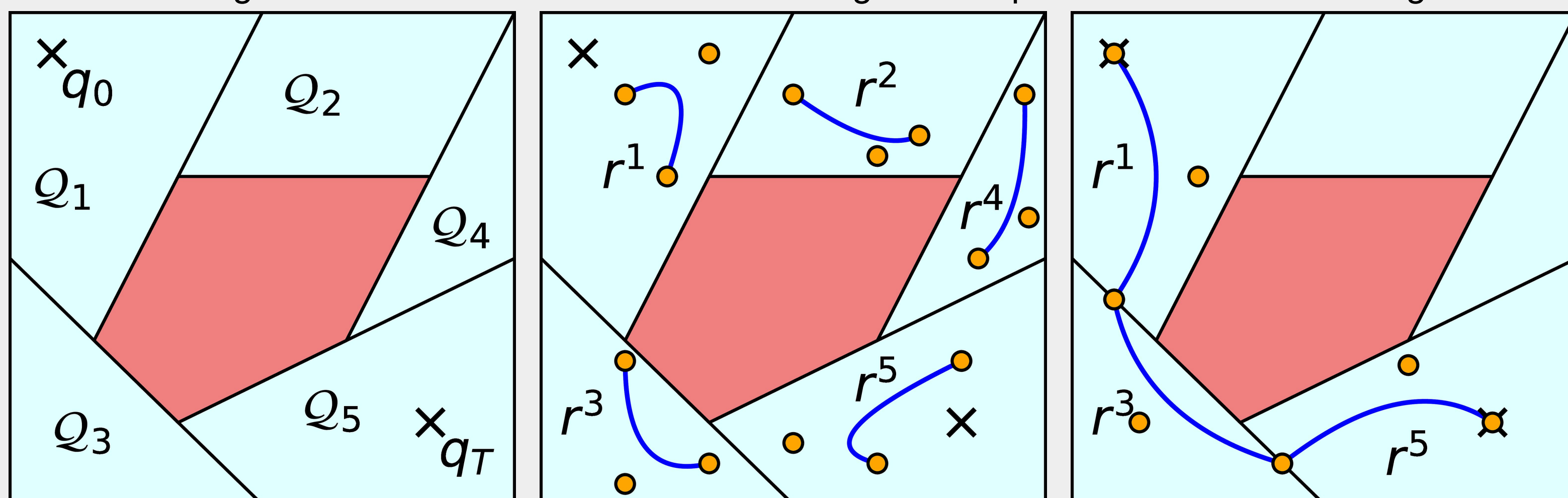
### Individual Degrees of Freedom



## Planning through Convex Sets



Constructing convex subsets of collision-free configuration space with the *IRIS-NP* algorithm.



Reproduced from *Motion Planning around Obstacles with Convex Optimization*, Marcucci et. al.

## Growing Convex Sets

### Algorithm 1: Constrained IRIS (Single Iteration)

**Input:** Bounding Box  $\mathcal{H}_0(A_0, b_0)$   
Hyperellipsoid  $\mathcal{E}(C, d)$  s.t.  $d \in \mathcal{H}_0(A_0, b_0)$   
Constraint Sets  $\mathcal{CS}_1, \dots, \mathcal{CS}_k$   
**Output:** Halfspace Intersection  $\mathcal{H}(A, b)$

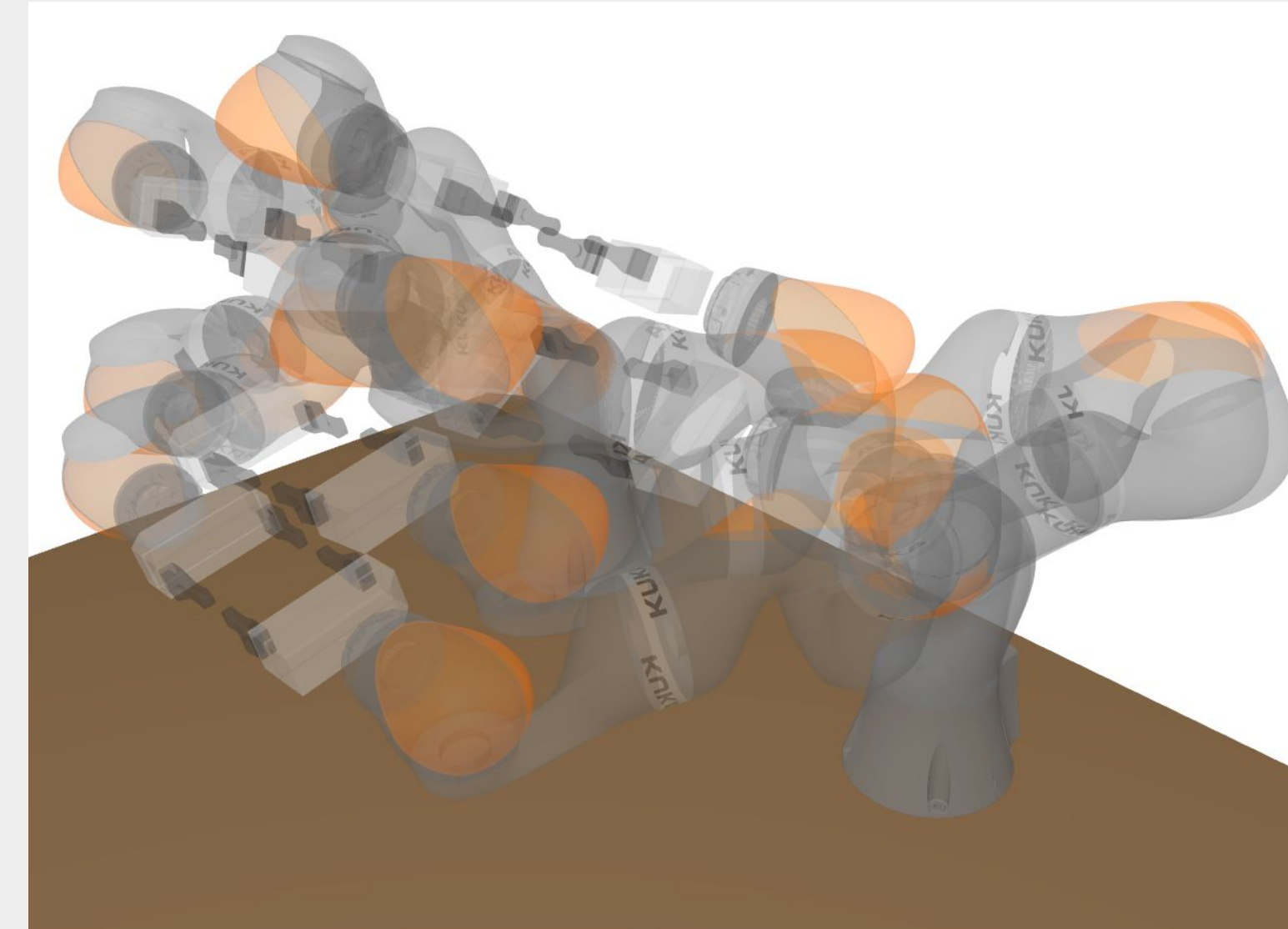
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1  $A \leftarrow A_0, b \leftarrow b_0$ 
2 for  $\mathcal{CS} = \mathcal{CS}_1, \dots, \mathcal{CS}_k$  do
3   repeat
4      $(a^*, b^*) \leftarrow \text{SOLVE}[(6), \{A, b, C, d, \mathcal{CS}\}]$ 
5      $A \leftarrow \text{VSTACK}(A, a^*), b \leftarrow \text{VSTACK}(b, b^*)$ 
6   until INFEASIBLE
7 return  $\mathcal{H}(A, b)$ 

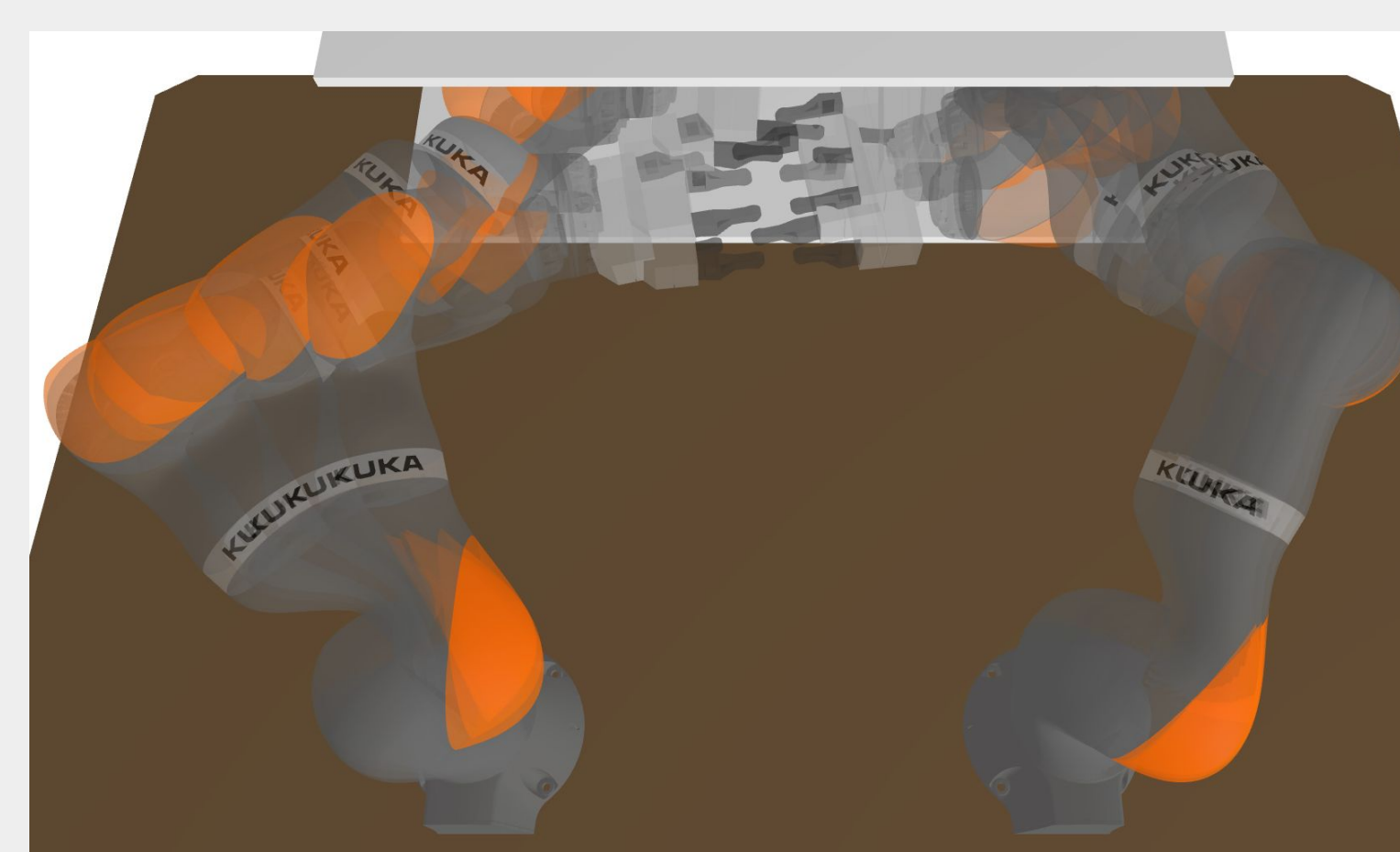
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Counterexample  $\min_q \|q - d\|_C^2$   
Search Program (6) s.t.  $Aq \leq b$   
 $q \notin \mathcal{CS}$

We visualize a C-space convex set by plotting multiple configurations contained within it.



Individual sets cover large parts of task space.

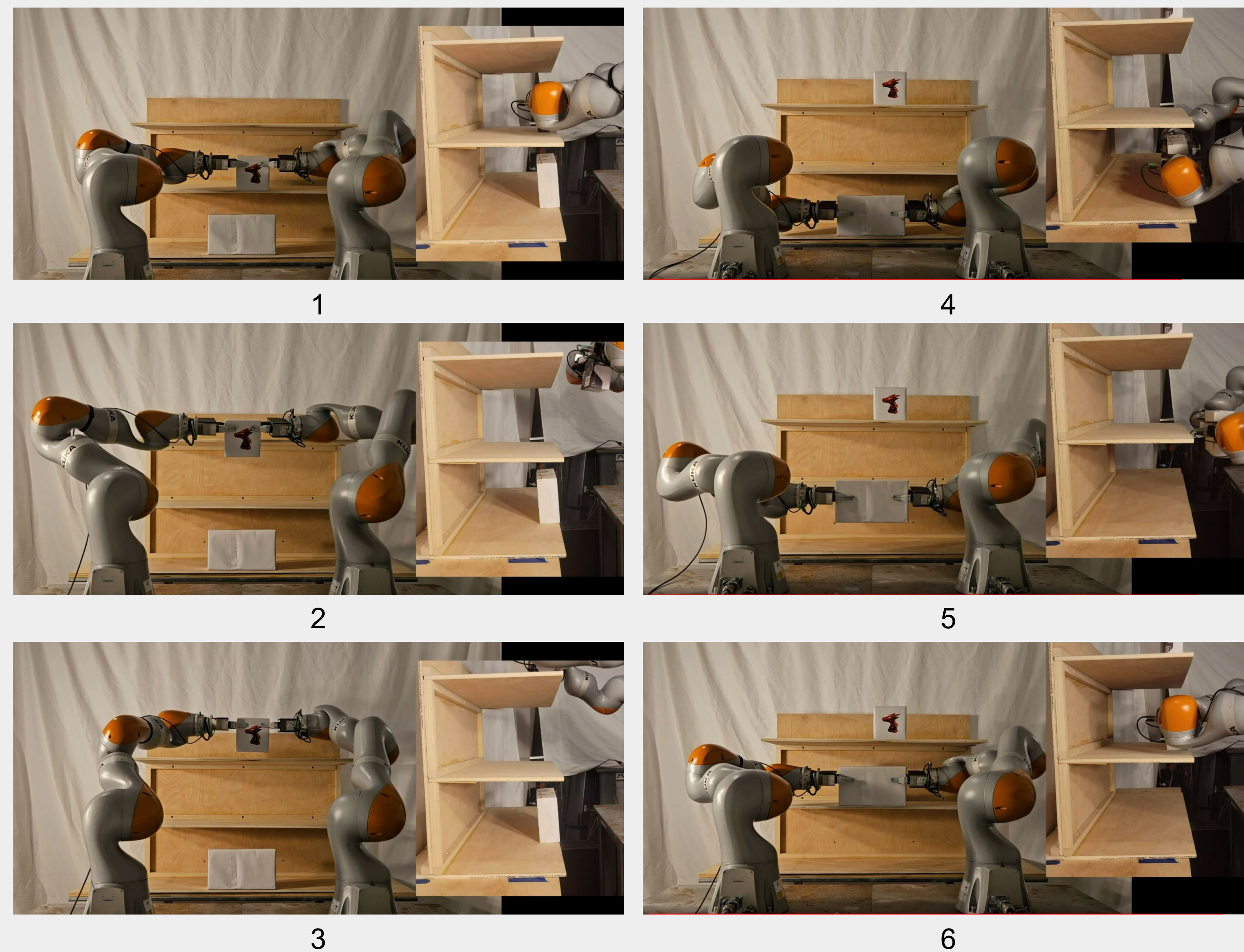


Individual sets allow a robot to reach into and out of a set of shelves.



Individual sets can treat a varying grasp distance as an additional degree of freedom.

## Bimanual Motion Planning



Moving boxes of different sizes between a set of shelves with the *Graph of Convex Sets* planner.

## Comparison of Algorithms

Method	Top to Middle	Middle to Bottom	Bottom to Top
Trajopt	4.58*	2.85*	<b>4.35*</b>
Atlas-BiRRT	4.72	5.04	6.61
Atlas-PRM	5.43	5.67	6.99
IK-Trajopt	4.24*	<b>1.81*</b>	8.87
IK-BiRRT	9.91	8.69	11.42
IK-PRM	4.67	8.93	9.21
IK-GCS	<b>2.09</b>	3.32	5.62

Comparison of path lengths (in configuration space) for different planning approaches.

- Asterisks denote plans that had collisions.
- BiRRT plans are averaged over 10 runs.

Method	Top to Middle	Middle to Bottom	Bottom to Top
Trajopt	10.37	5.36	7.25
Atlas-BiRRT	140.82	155.91	201.32
Atlas-PRM	0.69	0.86	0.96
IK-Trajopt	19.48	18.70	22.29
IK-BiRRT	49.42	52.53	54.10
IK-PRM	<b>0.46</b>	<b>0.64</b>	<b>0.61</b>
IK-GCS	3.41	2.32	3.32

Comparison of online planning runtimes (in seconds).

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