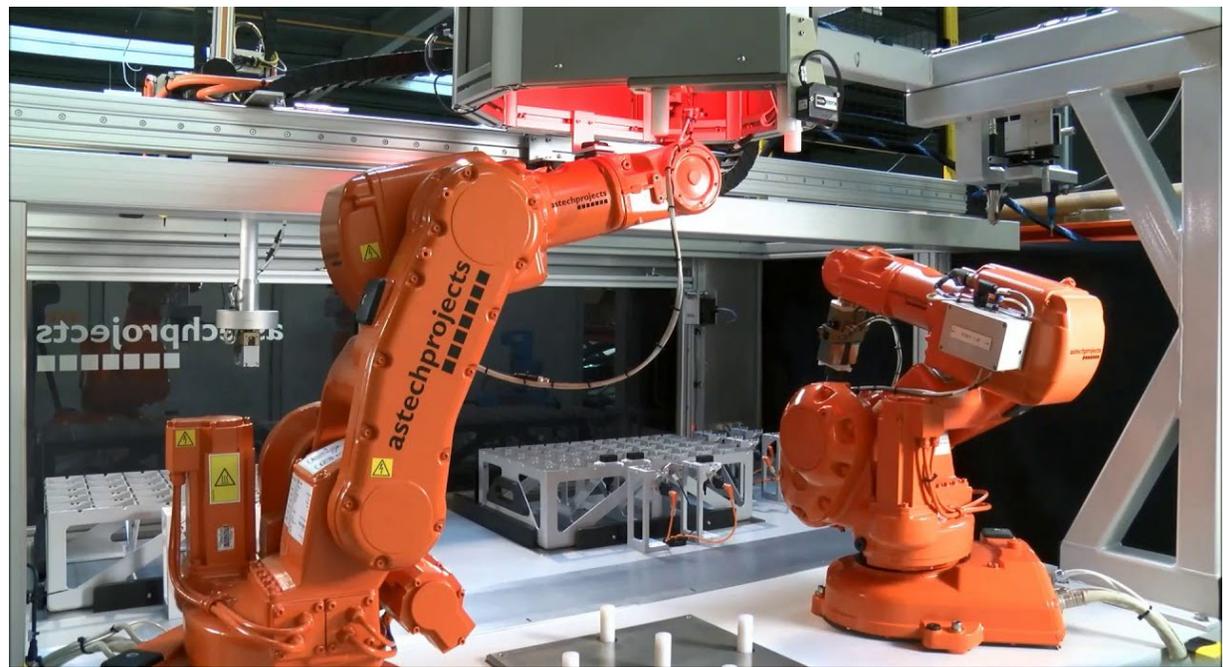


Efficient and High-quality Prehensile Rearrangement in Cluttered and Confined Spaces

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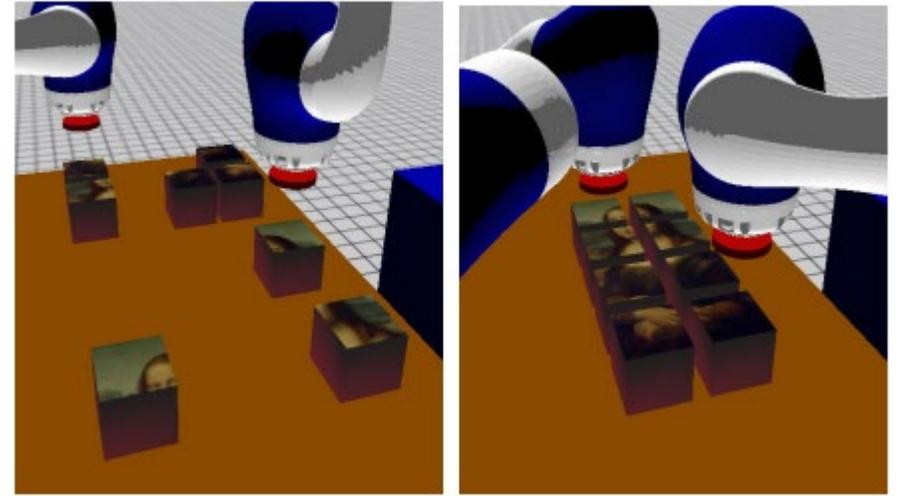
Rearrangement in cluttered and confined spaces



1. **Clutter:** The robot cannot directly access all objects – **the swept volume of the robot may cause robot-object collisions**
2. **Limited/Confined manipulation space:** Once an object is grasped, it cannot be lifted high enough – **cannot waive object-object collisions**
3. Must take both **robot-object constraints** and **object-object constraints** into account.

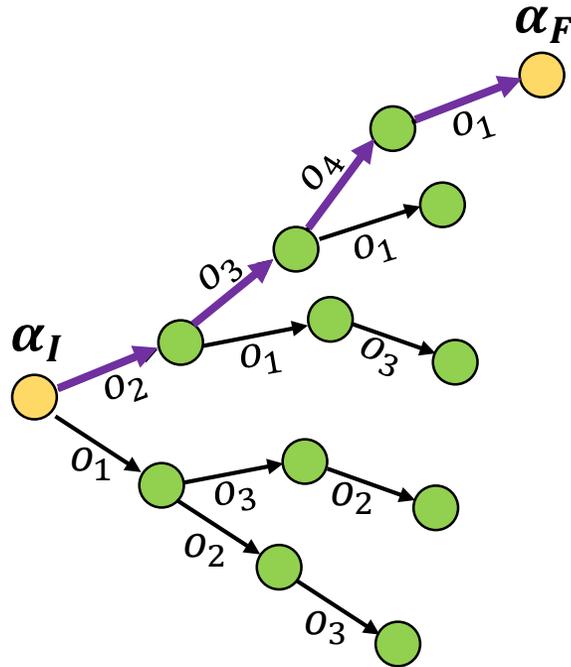
vs.

Rearrangement in tabletop setup



1. Allow the robot to reach the majority of objects at any point in time by using top-down grasps – **simplify robot-object interactions**
2. Once an object is grasped, it can be lifted sufficiently high relative to other objects – **assume no object-object collisions**
3. The only hard constraints arise from **the potential between the start and goal poses of objects**

Search for **an ordering with which object are rearranged**
to successfully fulfill the task



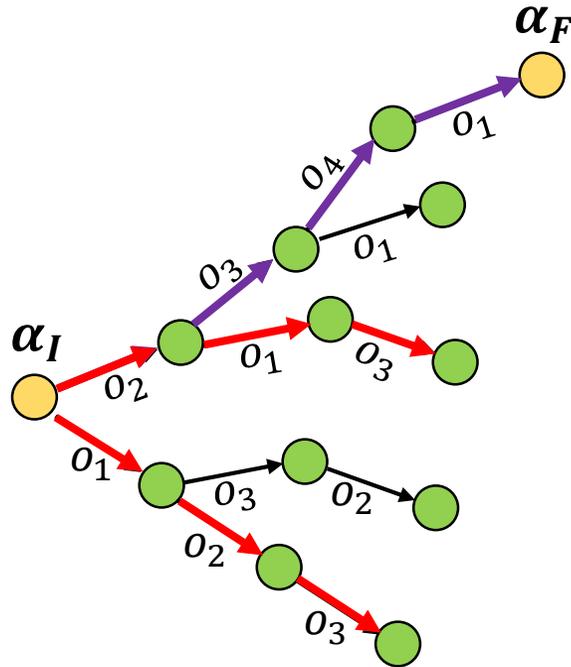
Monotone: Objects need to be moved at most once to solve the problem.
Non-monotone: At least one object needs to be moved to a buffer before moved to its goal.

Complexity: $O(n!)$: Does not scale well with the number of objects

Search for an ordering with which object are rearranged to successfully fulfill the task



Kai Gao



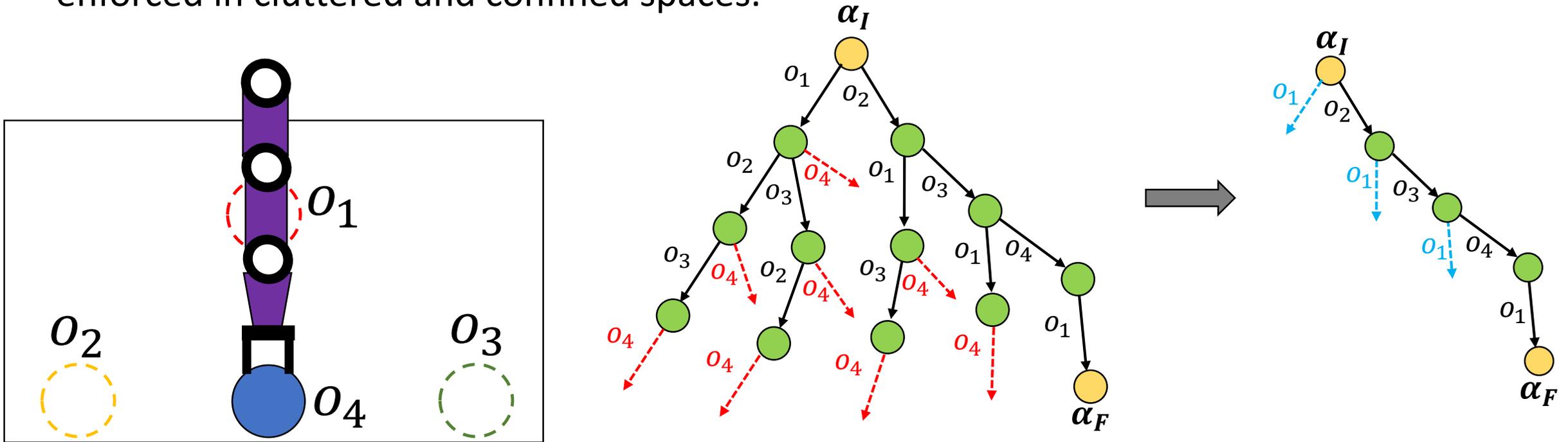
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Complexity: $O(n!)$: Does not scale well with the number of objects

Observation: Instead of searching the space of all object permutations $O(n!)$ to solve monotone instances, it is sufficient to search the space of object arrangements $O(2^n)$.

Observation: Even in the **reduced arrangement space**, there is a lot of **redundancy**.

Some branches of the search tree will not lead to a solution, as they violate constraints enforced in cluttered and confined spaces.

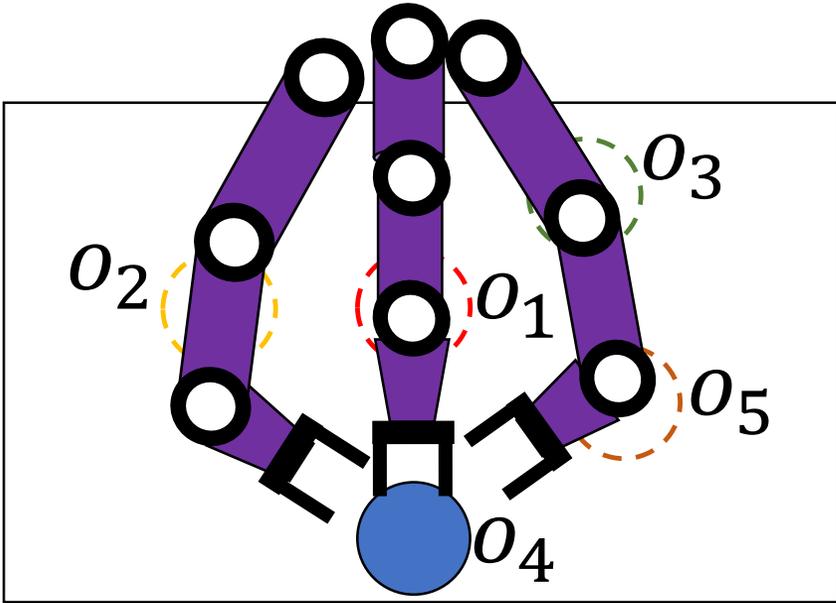


Don't move o_4 when o_1 is at the goal!!

Don't move o_1 when o_4 is at the start...

$$\tilde{\mathcal{A}}[o_1] = \{\alpha \mid \alpha[o_4] = \alpha_c[o_4]\}$$

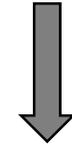
Another example



Denote \mathcal{C}_4^j as the colliding object set, where the goals of these objects hinder the grasping of o_4 for the j -th configuration.

$$\mathcal{C}_4^1 = \{o_2\}, \mathcal{C}_4^2 = \{o_1\}, \mathcal{C}_4^3 = \{o_3, o_5\}$$

$$\mathcal{C}_4^1 \times \mathcal{C}_4^2 \times \mathcal{C}_4^3$$



$$c^1 = \{o_1, o_2, o_3\}$$

$$c^2 = \{o_1, o_2, o_5\}$$

$$c^1 = \{o_1, o_2, o_3\}$$

Don't move o_4 when o_2, o_1, o_3 are all at their goals!!!

Don't move o_1 when o_4 is at start while o_2, o_3 are both at their goals....

$$\tilde{\mathcal{A}}[o_1] = \{\alpha \mid \alpha[o_4] = \alpha_c[o_4], \alpha[o_2] = \alpha_F[o_2], \alpha[o_3] = \alpha_F[o_3]\}$$

Constraint Informed Rearrangement Solver (CIRS)

Algorithm 1: CIRS($\alpha_C, \alpha_F, \mathcal{O}, K$)

```
1  $\mathcal{A}_{invalid} = \text{DETECTINVALIDITY}(\alpha_C, \alpha_F, \mathcal{O}, K)$   
2 return CIDFSDP( $\emptyset, \alpha_C, \alpha_F, \mathcal{A}_{invalid}$ )
```

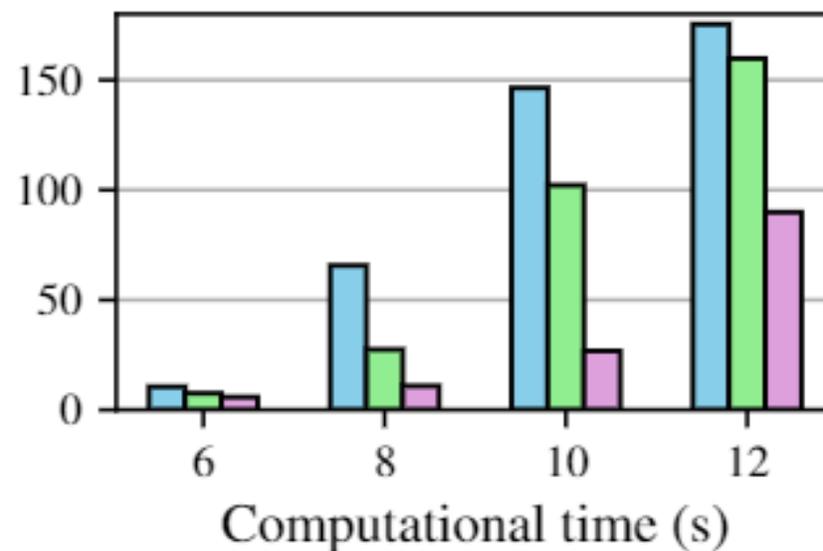
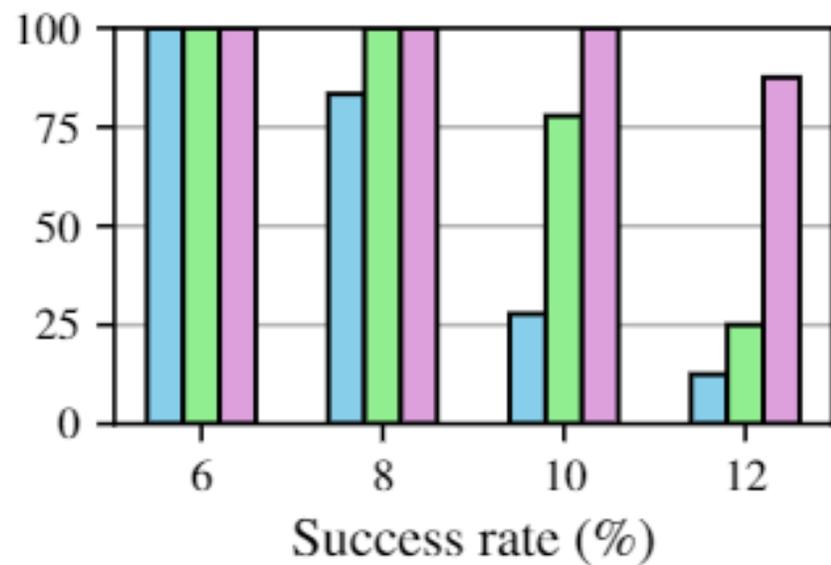
Algorithm 2: DETECTINVALIDITY($\alpha_C, \alpha_F, \mathcal{O}, K$)

```
1 for  $o_i \in \mathcal{O}$  do  
2    $\mathcal{A}_{invalid}[o_i] = \emptyset$   
3 for  $o_i \in \mathcal{O}$  do  
4    $[q^1, \dots, q^K], [c_i^1, \dots, c_i^K] =$   
    $\text{GENERATEARMCONFIGURATIONS}(\alpha_C, \alpha_F, K)$   
5   for  $c^j \in \{c_i^1 \times \dots \times c_i^K\}$  do  
6      $\tilde{\mathcal{A}} = \text{ELICITARRANGEMENTS}(c^j)$   
7      $\mathcal{A}_{invalid}.\text{ADD}(\tilde{\mathcal{A}})$   
8 return  $\mathcal{A}_{invalid}$ 
```

Algorithm 3: CIDFS_{DP}($T, \alpha_C, \alpha_F, \mathcal{A}_{invalid}$)

```
1 for  $o \in \mathcal{O} \setminus \mathcal{O}(\alpha_C)$  do  
2   if  $\alpha_C \in \mathcal{A}_{invalid}[o]$  then continue  
3    $\alpha_{new}[\mathcal{O} \setminus \{o\}] = \alpha_C[\mathcal{O} \setminus \{o\}]$   
4    $\alpha_{new}[o] = \alpha_F[o]$   
5   if  $\alpha_{new} \notin T$  then  
6      $\pi \leftarrow \text{MOTIONPLANNING}(\alpha_C, \alpha_{new}, o)$   
7     if  $\pi \neq \emptyset$  then  
8        $T[\alpha_{new}].parent \leftarrow \alpha_C$   
9       if  $\alpha_{new} \neq \alpha_F$  then  
10         $T = \text{CIDFS}_{DP}(T, \alpha_{new}, \alpha_F, \mathcal{A}_{invalid})$   
11        if  $\alpha_F \in T$  then return  $T$   
12 return  $T$ 
```

Experimental results



Legend: mRS (light blue), DFS_{DP} (light green), CIRS (light purple)

Other contributions in the current line of work

1. Propose a non-monotone global framework for solving non-monotone problems with high-quality solutions, i.e., fewer actions in total to fulfill a task.
2. Propose a pre-processing tool (labeled roadmap) which significantly speeds up online motion planning query.

Future Work

1. Generalize all the possible constraints to save more computational time.
2. Learn failure cases during the search.
3. See if we can come up with a better default object ordering with which the search uses as a heuristic.
4. Better reasoning about object and buffer selection in tackling non-monotone problems.

Demonstration



Yinglong Miao



Reference

1. <https://www.rt.com/news/419926-robot-fridge-beer-nvidia-competition/>
2. <https://www.atechprojects.co.uk/company-profile-media-gallery/>
3. <https://arxiv.org/pdf/1810.12202.pdf>

Thanks for Listening!

Acknowledgments

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