

ASAP: Automated Sequence Planning for Complex Robotic Assembly with Physical Feasibility

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¹MIT CSAIL ²Autodesk Research ³University of Waterloo ⁴Texas A&M University



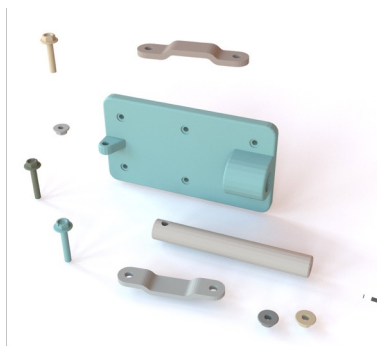
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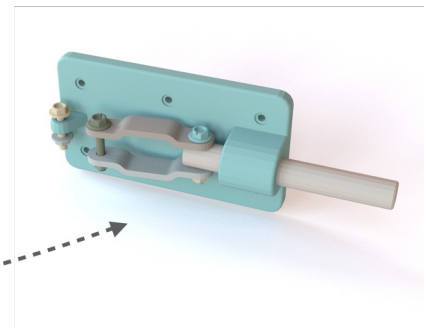
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Motivation

In manufacturing industry, the assembly process is usually planned by humans with hardcoded instructions.



```
select_part(A)  
move_up(10cm)  
move_right(20cm)  
...
```



Labor-intensive

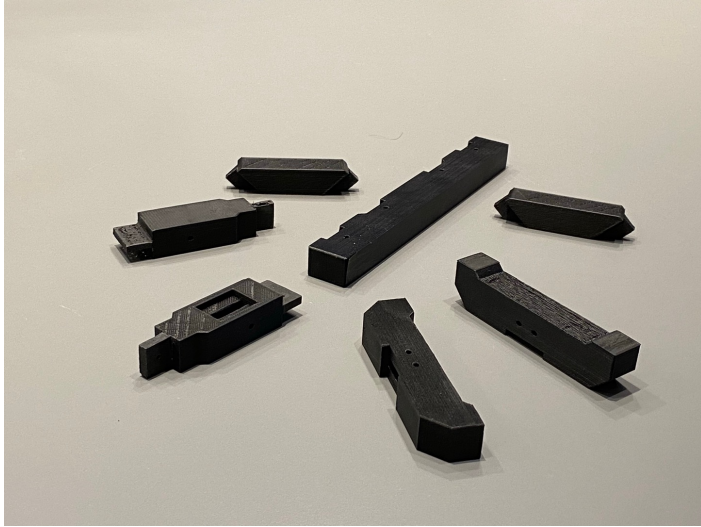
Slow

Tedious

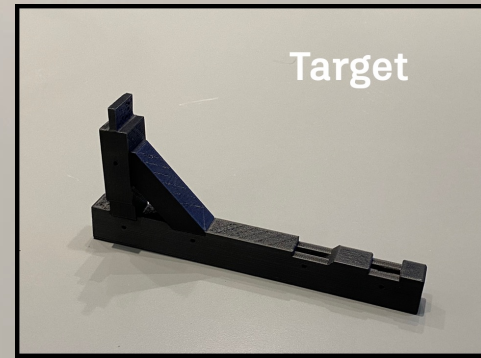
Error-prone

Inflexible

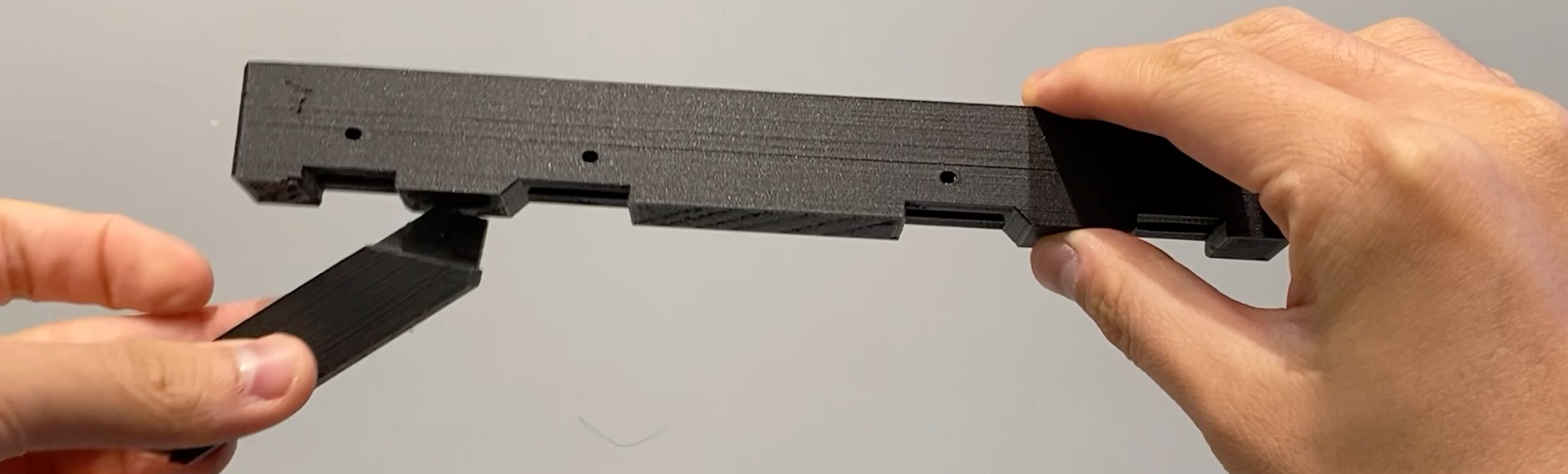
Motivation



Failures could easily happen during assembly without careful planning ...



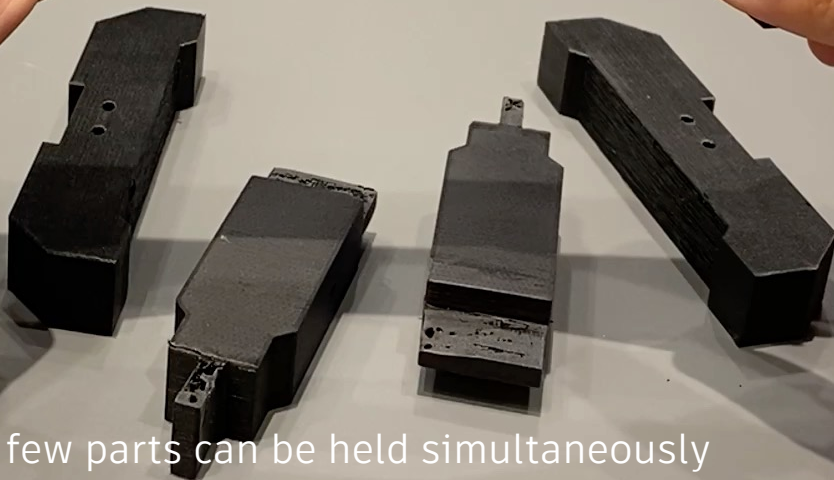
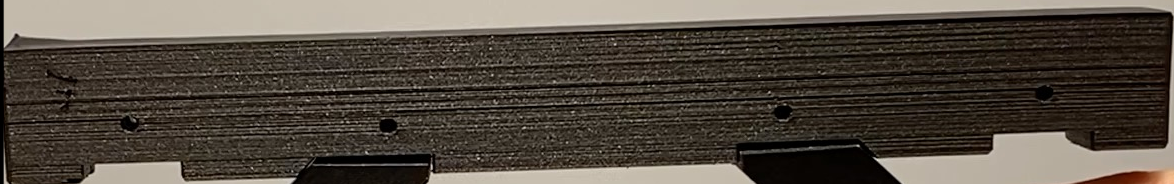
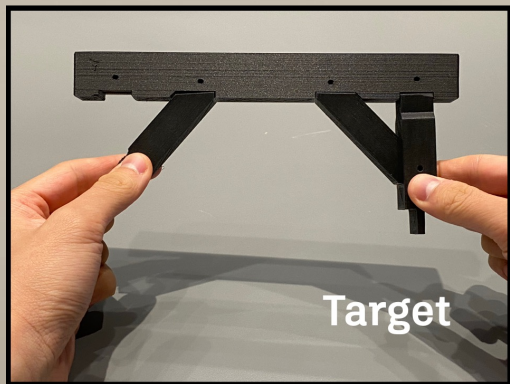
Failure 1: Sequence is not geometrically feasible due to part precedence



Failure 2: Sequence is not stable under gravity

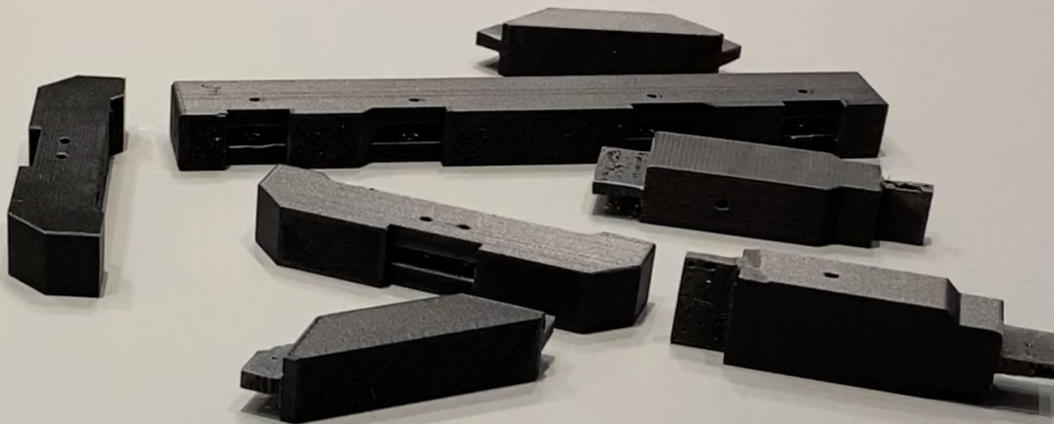


Target



Failure 3: Only a few parts can be held simultaneously
(Switching hands to other parts will fail)

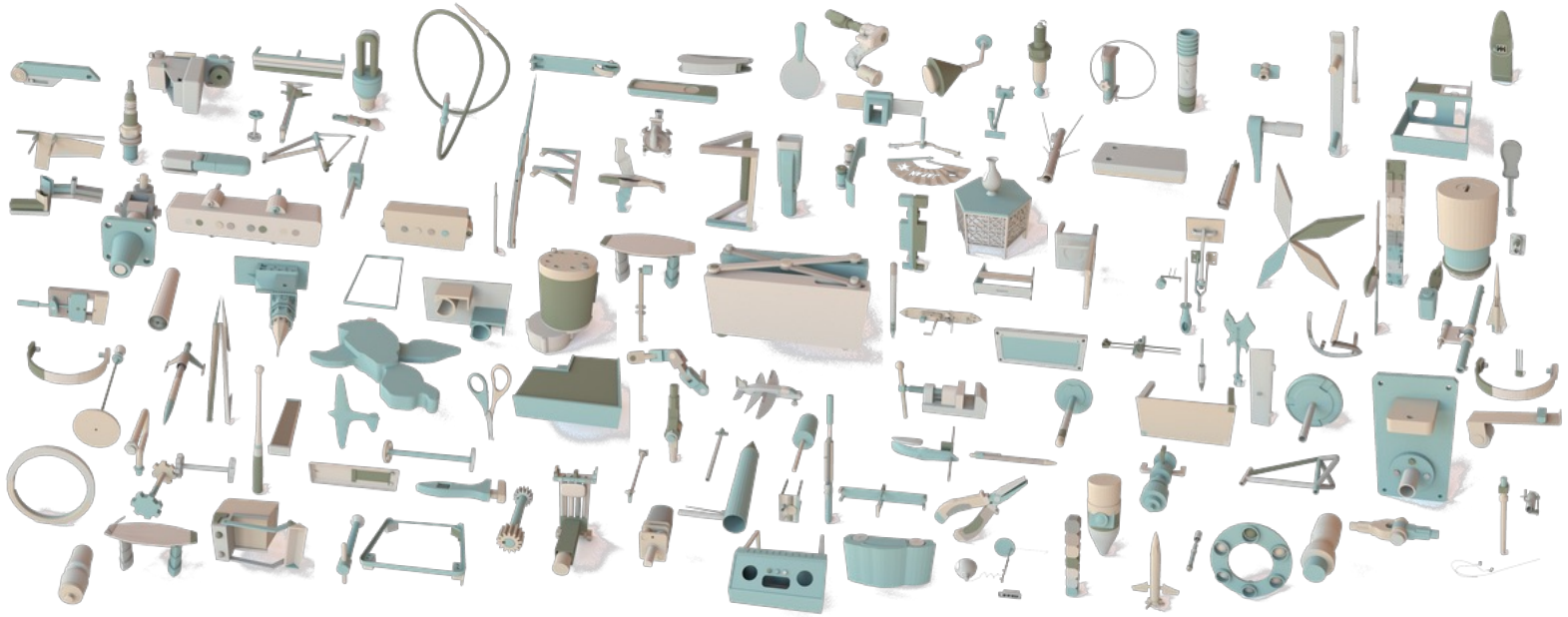
Target



Success: The assembly sequence is **physically feasible** only if the assembly order is correct, collision-free paths can be found, poses are stable, and proper parts are held

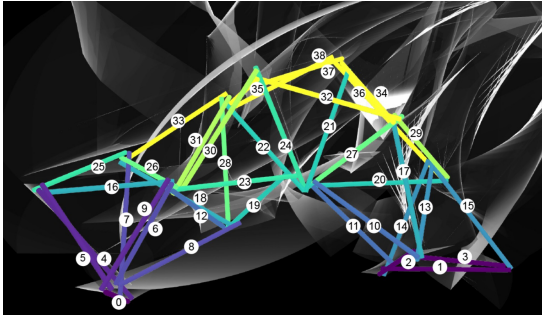
Challenges

How to solve for such physically feasible plans autonomously?

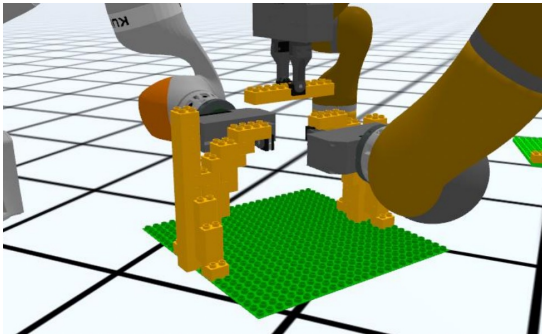


Is it possible to generalize to many more complex assemblies?

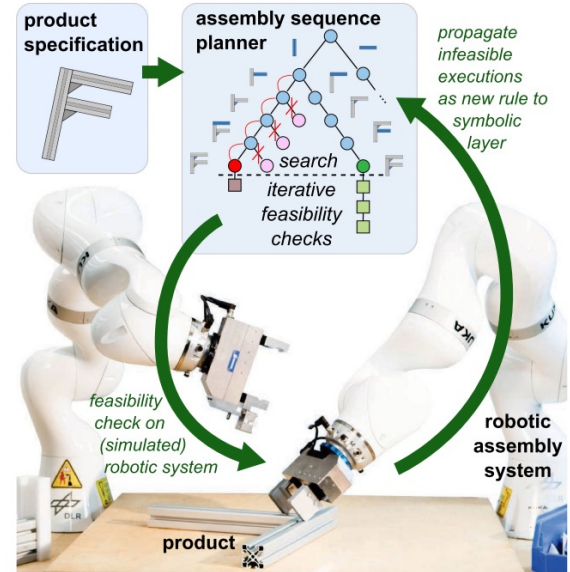
Related Works



Bar Structure Assembly
[Huang et al. 2021]



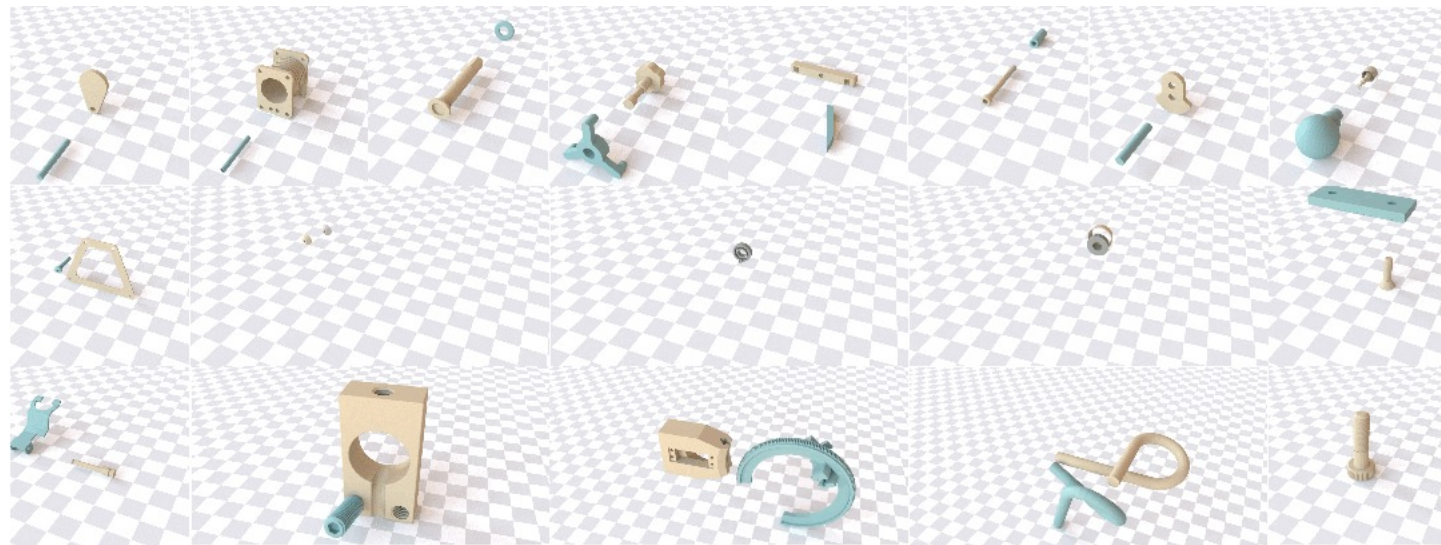
LEGO Brick Assembly
[Nagele et al. 2020]



Aluminum Profile Assembly
[Rodriguez et al. 2019]

Not designed for general assemblies

Related Works



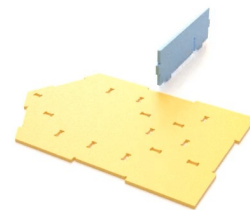
Assemble Them All [Tian et al. 2022]

Not applicable to real world with gravity & robots

ASAP

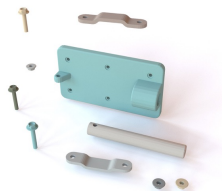
Our contributions

- An **automated** approach for generating **physically feasible** assembly sequences
- **Efficient planning** through tree-search, geometric heuristics, and graph neural networks
- **Stability guarantee** considering supporting surface and grippers
- Integrated grasp planning and inverse kinematics for **robotic execution**
- SOTA performance on **hundreds** of **complex** product assemblies

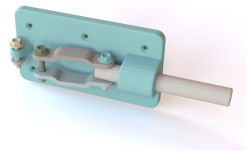


Problem Setup

Input & output



Object
Meshes



Assembled
Poses



ASAP



Robot Specifications
(Optional)



Assembly Sequences

Assembly Paths

Intermediate Poses

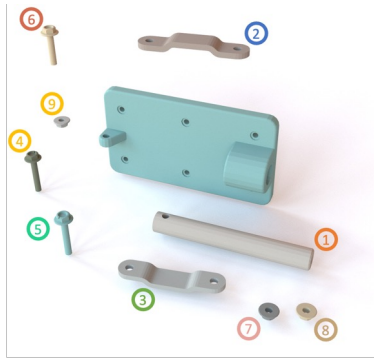
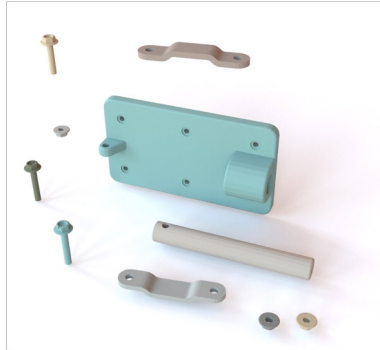
Parts to be Held

Grasps & Robot Motion
(optional)

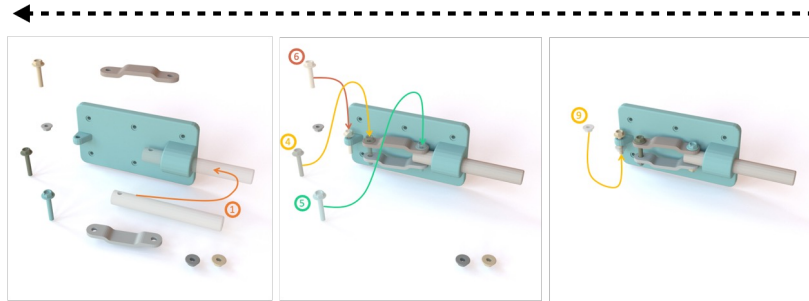
Complete Assembly Plans

Problem Setup

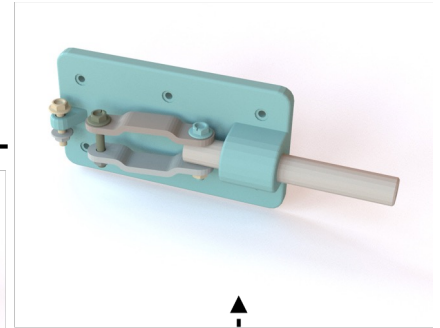
Assembly by disassembly



Disassembly Planning

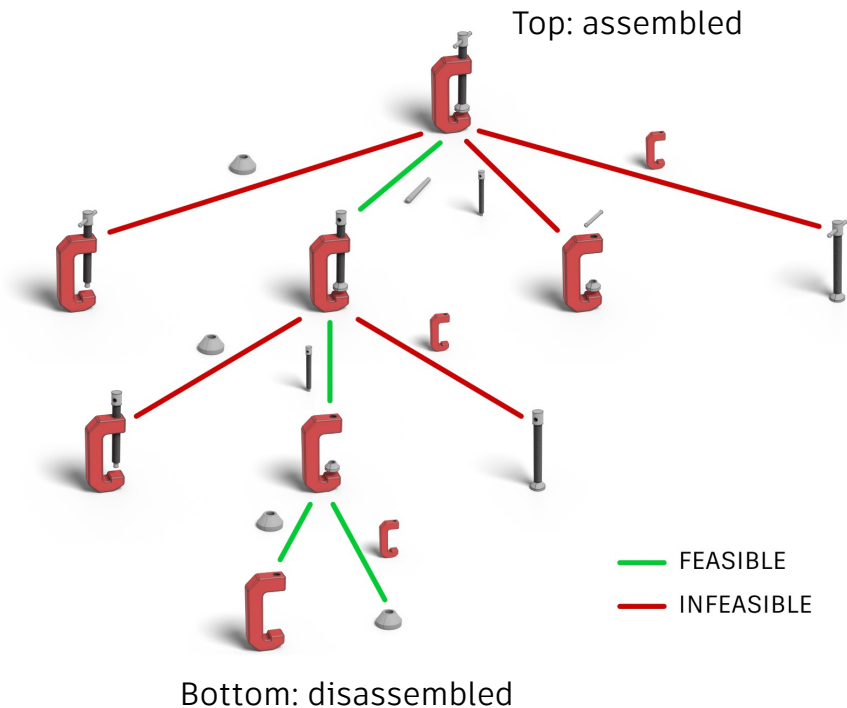


Reverse Plans



Physically-Feasible Assembly Planning

Disassembly tree search

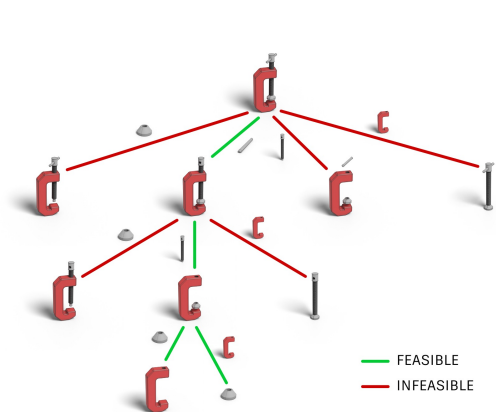


```
def asap():  
    tree.add_node(root_node)  
    for node in select_node(tree):  
        for part in select_part(node):  
            for pose in select_pose(node):  
                check_assemblable(node, part, pose)  
                check_stable(node, part, pose)  
            if success:  
                child_node = node \ {part}  
                tree.add_edge(node, child_node)  
    return tree
```

Node selection
Part selection
Pose selection
Feasibility evaluation

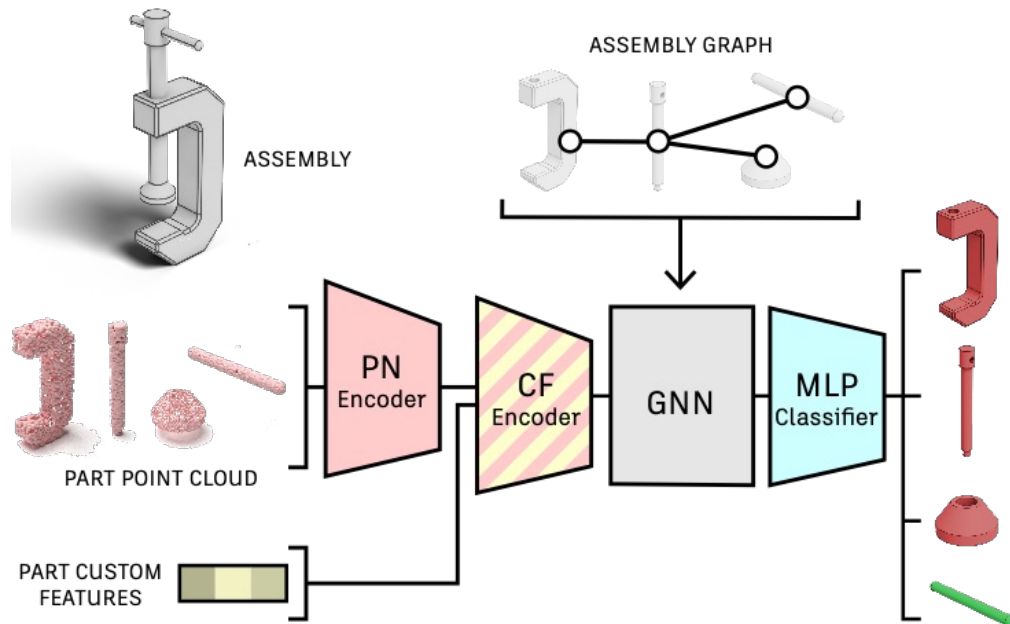
Physically-Feasible Assembly Planning

Part selection



Geometric heuristics:

distance of COM to assembly center, part volume, etc.

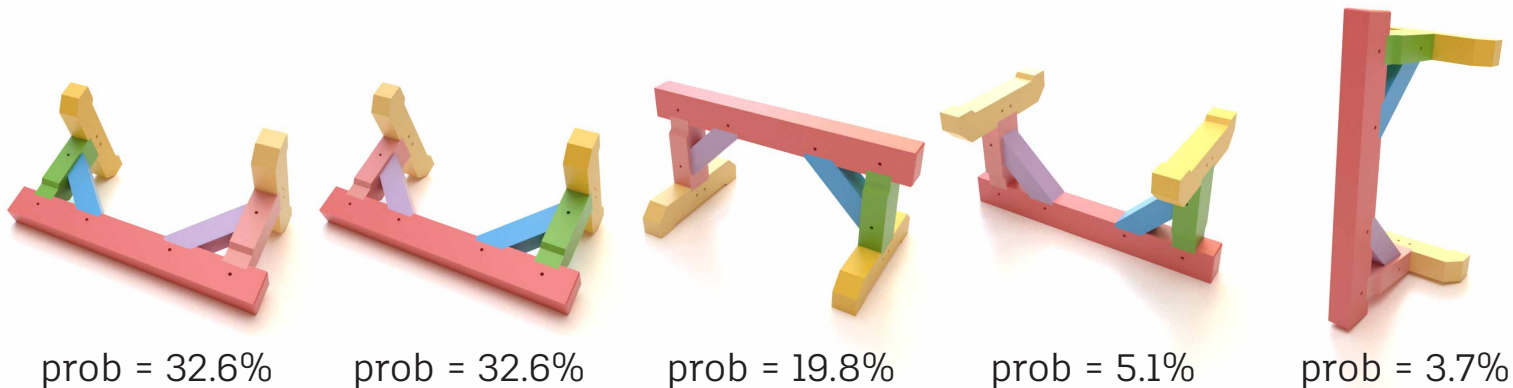


Learning-based guidance: GNN trained from simulation labels to suggest next parts to disassemble.

Physically-Feasible Assembly Planning

Pose selection

Quasistatic pose estimator for generating stable pose candidates



Pose reuse: try sticking with the same pose as much as possible

Physically-Feasible Assembly Planning

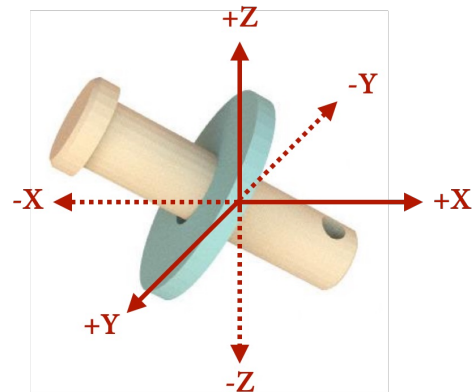
Feasibility evaluation: assemblability



Physics-based simulation

Applying force to disassemble

+



Tree search (BFS)

Finding correct force sequence

Assemble Them All [Tian et al. 2022]

Physically-Feasible Assembly Planning

Feasibility evaluation: stability

Physics-based simulation

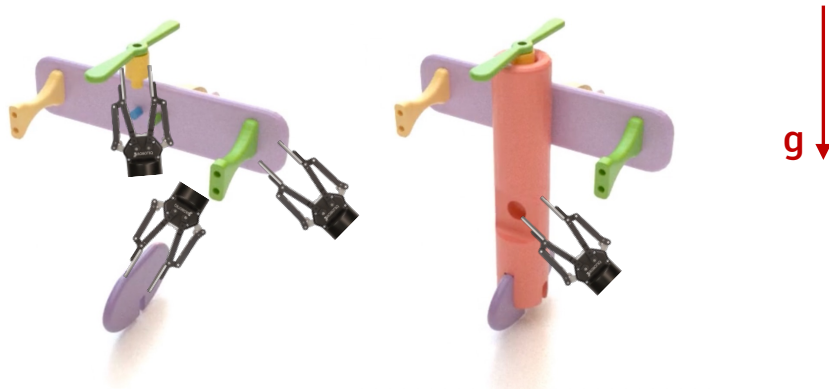
Check if any parts fall after certain time steps

Evaluate stability **conditioned on the pose and parts to hold**

Part-holding strategy

Identify which parts are to be held (by grippers/fixtures)

How to hold N parts by M fixtures?



# Parts to Hold	Acc. (%)	Speed Up
2	89.0	13.90x
3	90.5	17.03x
4	94.7	23.04x

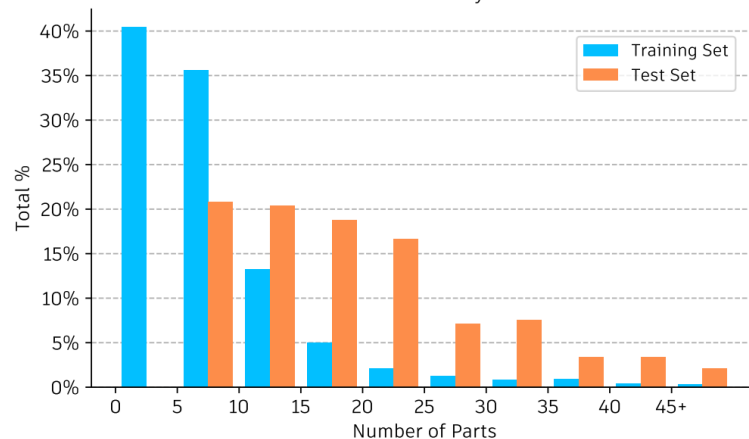
Greedy strategy compared to combinatorial strategy

Result

Quantitative evaluation



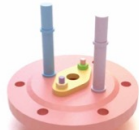
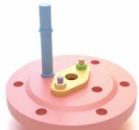
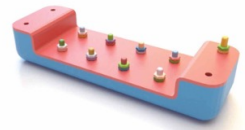
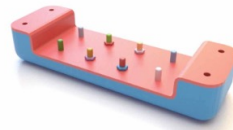
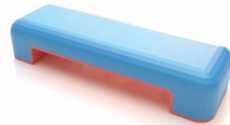
Distribution of Assemblies by Number of Parts



Method		Success Rate (%) (Low Budget)			Success Rate (%) (High Budget)		
		2 Parts Held	3 Parts Held	4 Parts Held	2 Parts Held	3 Parts Held	4 Parts Held
ASAP (Ours)	Heuristics	51.25	61.25	68.75	66.67	74.17	80.83
	Learning	54.58	62.92	69.58	67.08	76.25	82.08
Baseline	Random Permutation	14.58	25.42	41.25	27.92	43.33	55.42
	Genetic Algorithm [9]	14.17	25.83	40.00	30.83	41.25	51.25
	Assemble Them All [5]	19.17	27.08	35.42	30.42	46.25	56.67

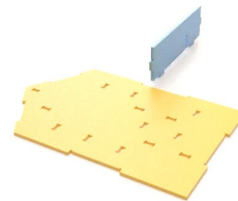
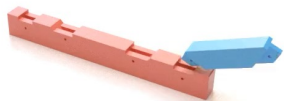
Result

Qualitative evaluation



Result

Qualitative comparison



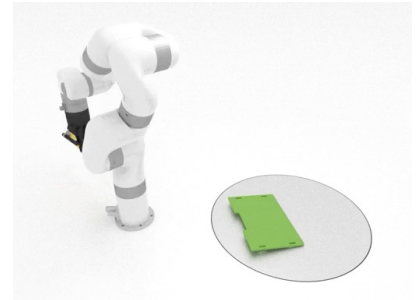
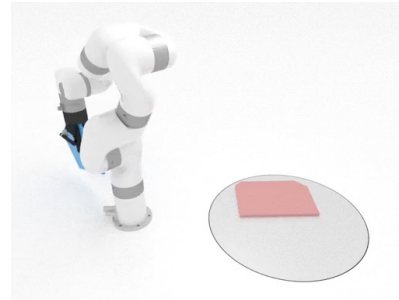
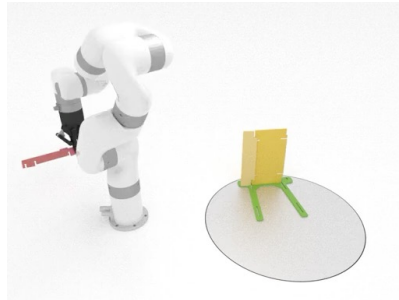
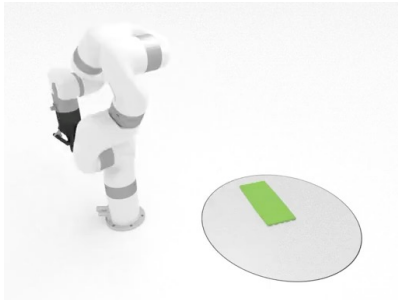
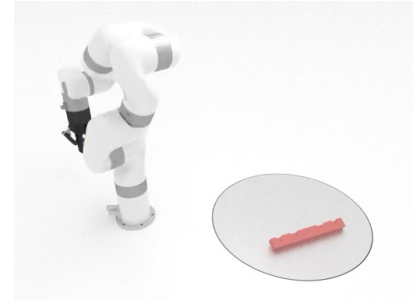
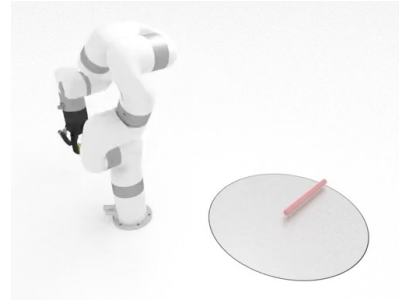
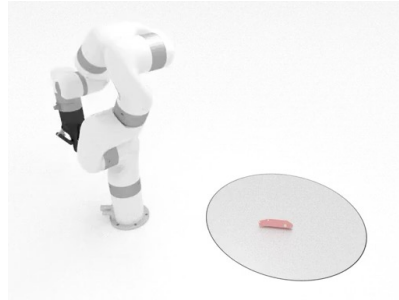
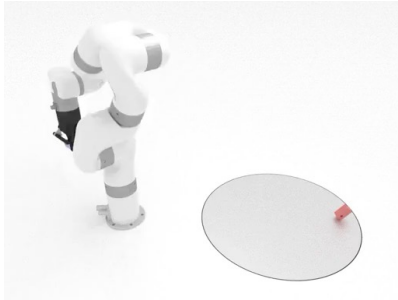
ASAP (Ours)



Assemble Them All [Tian et al. 2022]

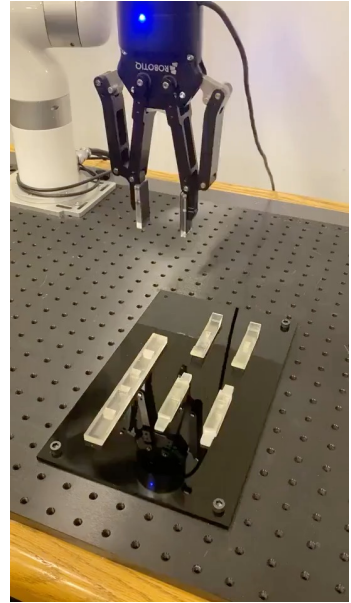
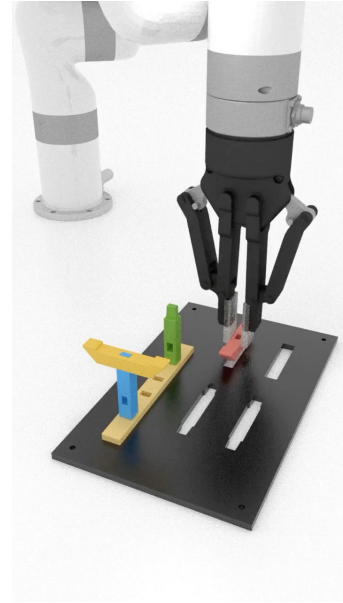
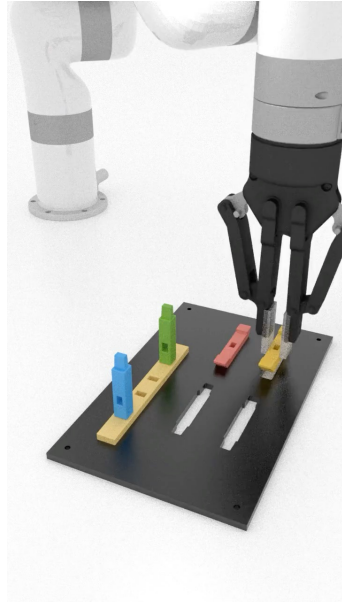
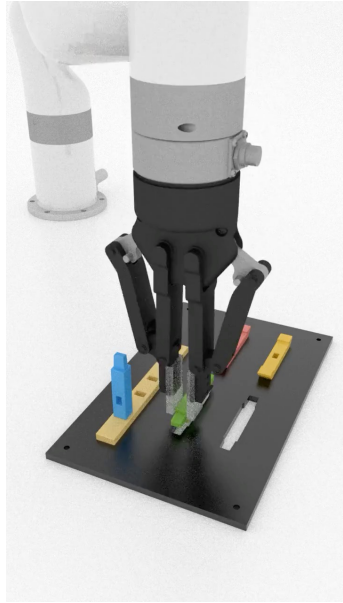
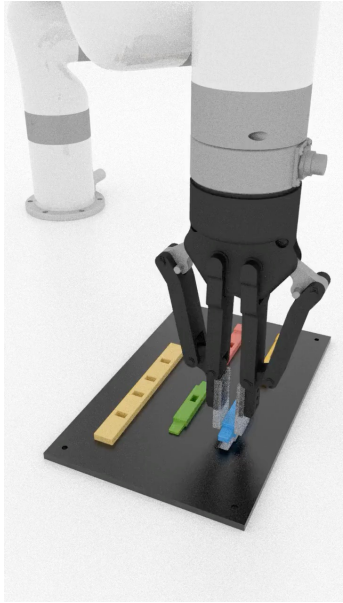
Result

Robotic execution – simulation



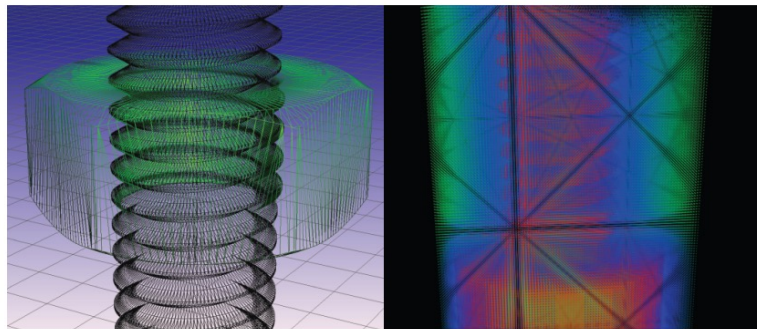
Result

Robotic execution – real world

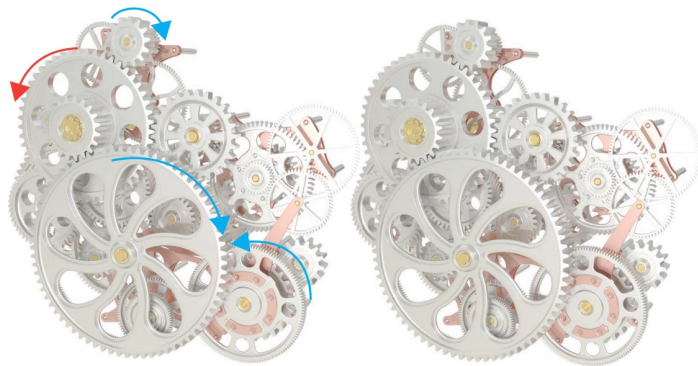


Future Work

Fast and robust physics simulation



Factory [Narang et al. 2022]



Affine Body Dynamics
[Lan et al. 2022]

Future Work

Learning from human demonstration

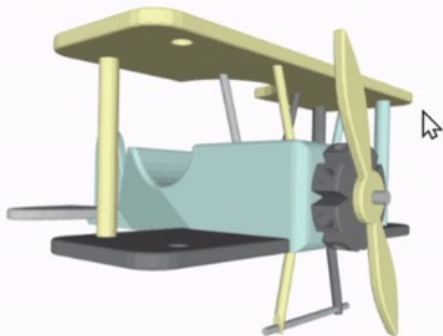
Disassemble this assembly

Which part would you remove next while keeping the rest of the assembly intact?

Instructions

See Examples

How to use 3D Model Viewer

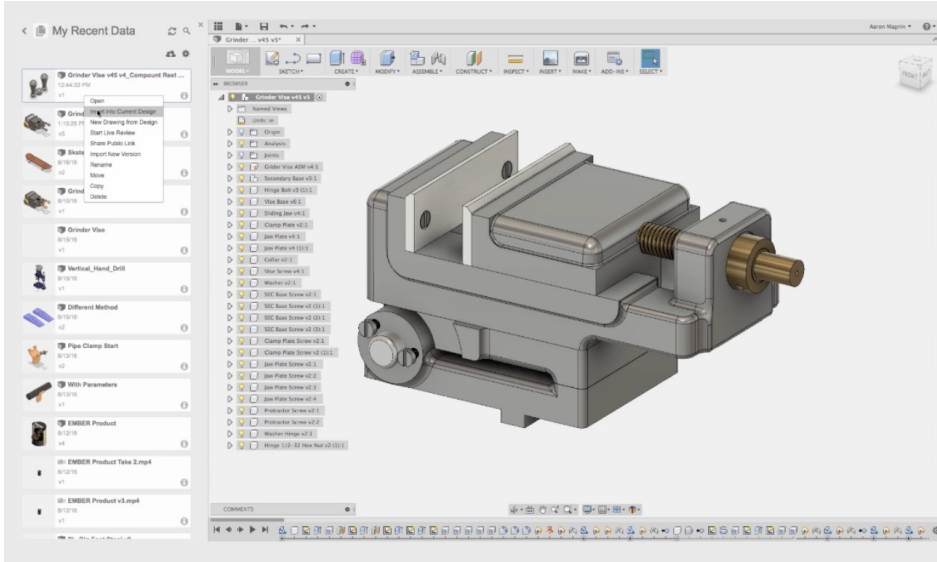


Submit

GNN can be trained from human-annotated labels to suggest next parts to disassemble

Future Work

Design tool integration

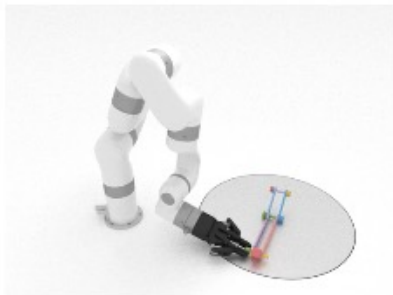


Autodesk Fusion 360

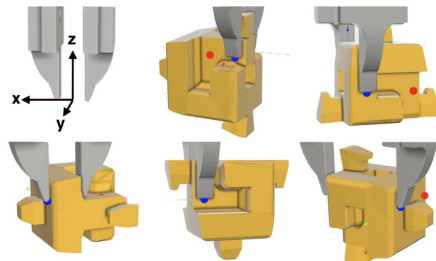
- Assembly manual generation
- Design feasibility verification
- Design-to-manufacturing

Future Work

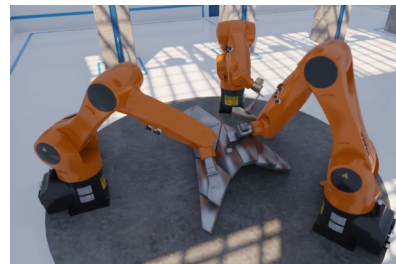
Real robot deployment



Sim2real



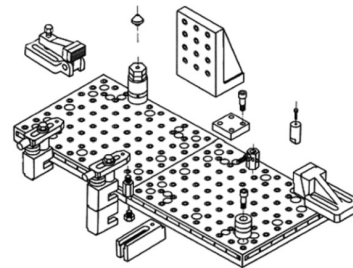
Grasp Planning



Multi-Arm Collaboration



Multiple Tools

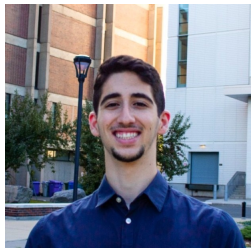


Fixture Generation

Collaborators



Karl D.D. Willis²



Bassel Al Omari³



Jieliang Luo²



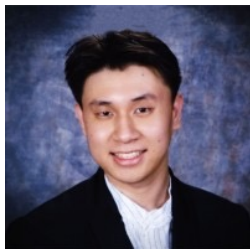
Pingchuan Ma¹



Yichen Li¹



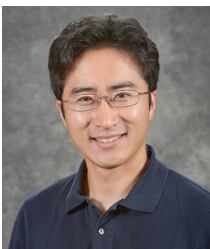
Farhad Javid²



Edward Gu¹



Joshua Jacob¹



Shinjiro Sueda⁴



Hui Li²

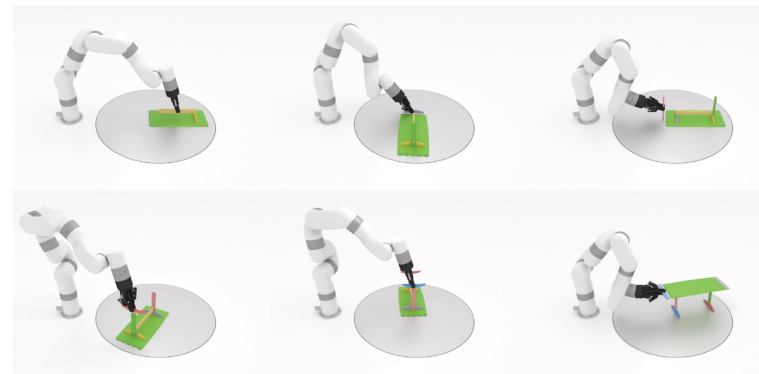
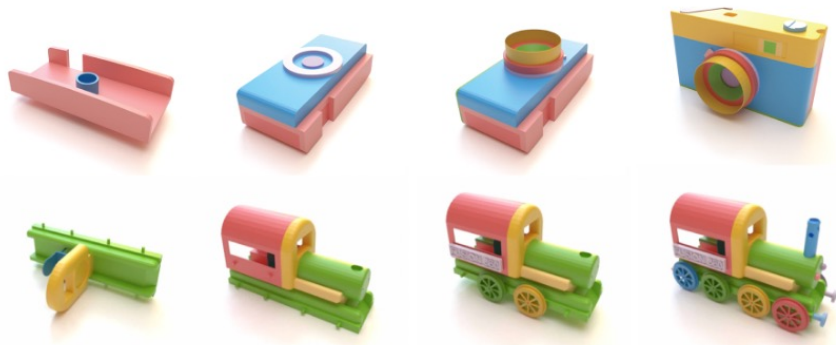


Sachin Chitta²

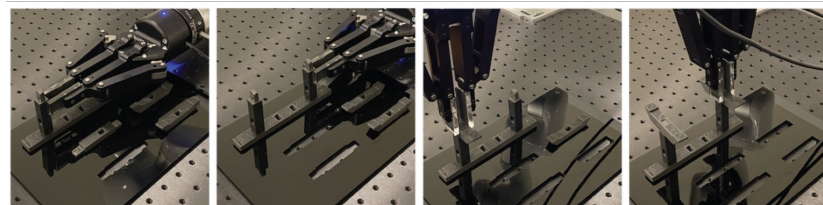
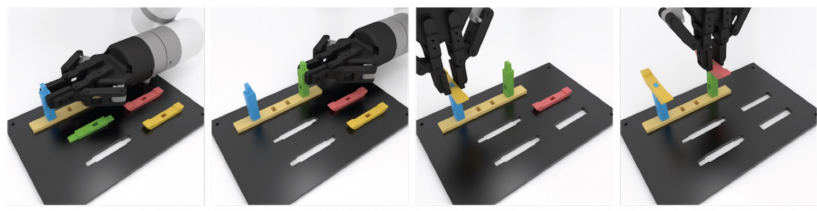


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Thank You



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