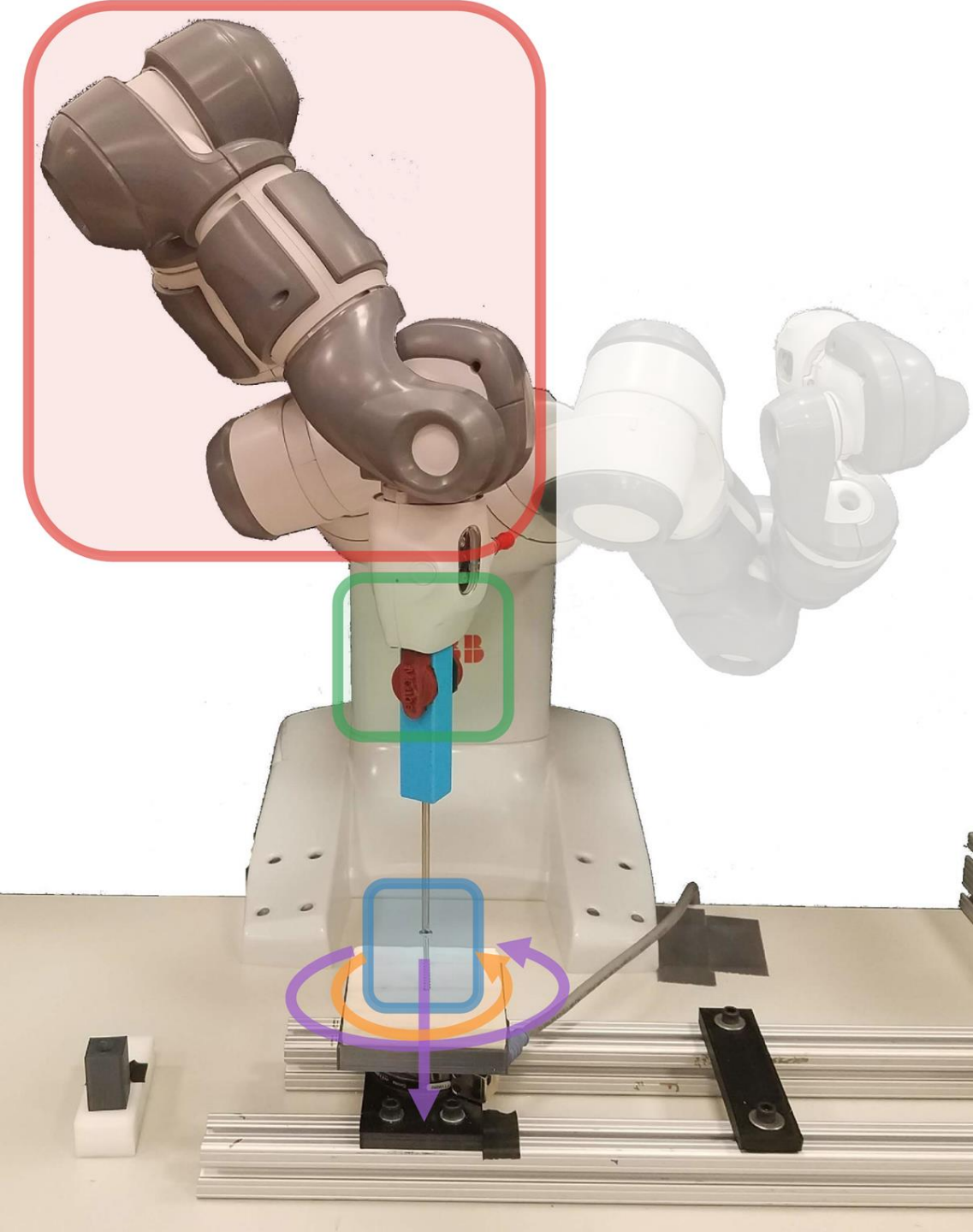


Force-and-Motion Constrained Planning for Tool Use

Rachel Holladay

Research Qualifying Exam
December 2019





Forceful Manipulation



The image is a collage of four photographs. The top-left shows a hammer with a wooden handle and a metal head. The top-right shows a hand using a red-handled screwdriver to turn a screw in a metal plate. The bottom-left shows a silver adjustable wrench with the number '374' engraved on it. The bottom-right shows a hand holding a large kitchen knife over a whole onion on a cutting board.

Forceful Manipulation with Hand Tools

Animal Tool Use

Animal Tool Use

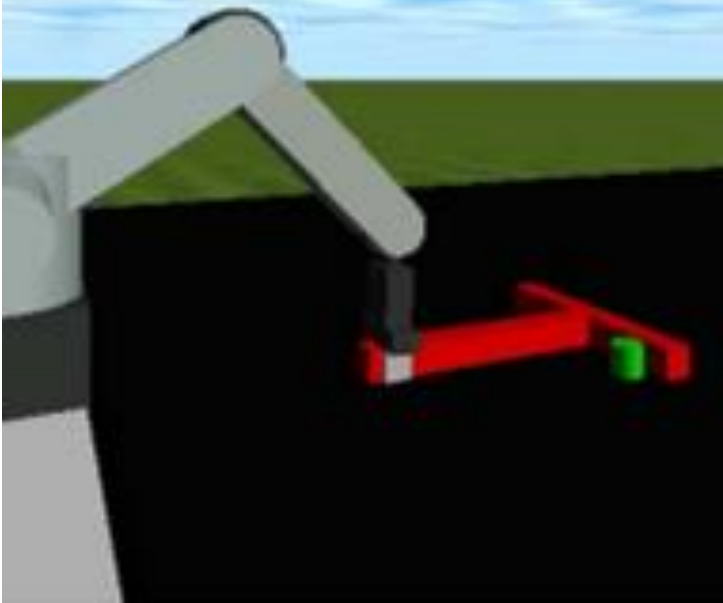
1. Extending reach

Animal Tool Use

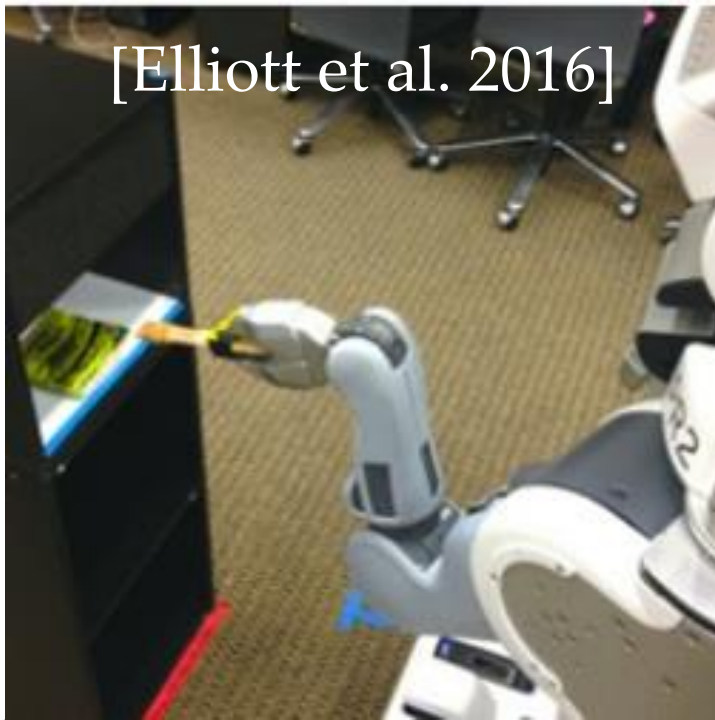
1. Extending reach

Sinapov et al. `08, Tikhanoff et al. `13, Jain et al. `14, Elliott et al. `16, Xie et al. `19

[Sinapov, Stoytchev 2008]



[Elliott et al. 2016]



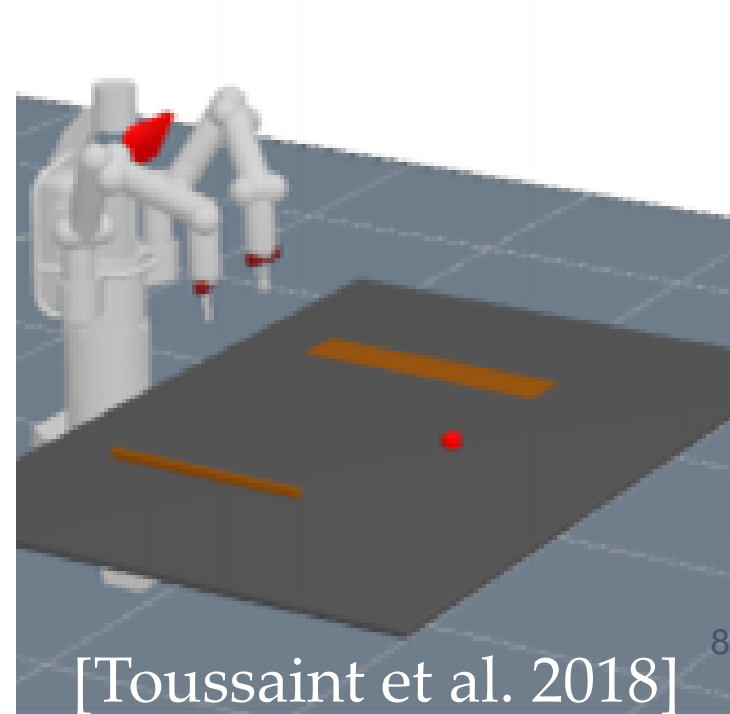
[Xie et al. 2019]



[Antunes et al. 2015]



[Jain, Inamura 2014]



[Toussaint et al. 2018]

Animal Tool Use

1. Extending reach

Sinapov et al. '08, Tikhanoff et al. '13, Jain et al. '14, Elliott et al. '16, Xie et al. '19

2. Amplifying mechanical force

Animal Tool Use

1. Extending reach

Sinapov et al. '08, Tikhanoff et al. '13, Jain et al. '14, Elliott et al. '16, Xie et al. '19

2. Amplifying mechanical force

Our Work

Animal Tool Use

1. Extending reach
2. Amplifying mechanical force
3. Control liquid flow

Sinapov et al. '08, Tikhanoff et al. '13, Jain et al. '14, Elliott et al. '16, Xie et al. '19

Our Work

Animal Tool Use

1. Extending reach

Sinapov et al. `08, Tikhanoff et al. `13, Jain et al. `14, Elliott et al. `16, Xie et al. `19

2. Amplifying mechanical force

Our Work

3. Control liquid flow

4. Enhance effectiveness of antagonistic displays

Animal Tool Use

1. Extending reach

Sinapov et al. '08, Tikhanoff et al. '13, Jain et al. '14, Elliott et al. '16, Xie et al. '19

2. Amplifying mechanical force

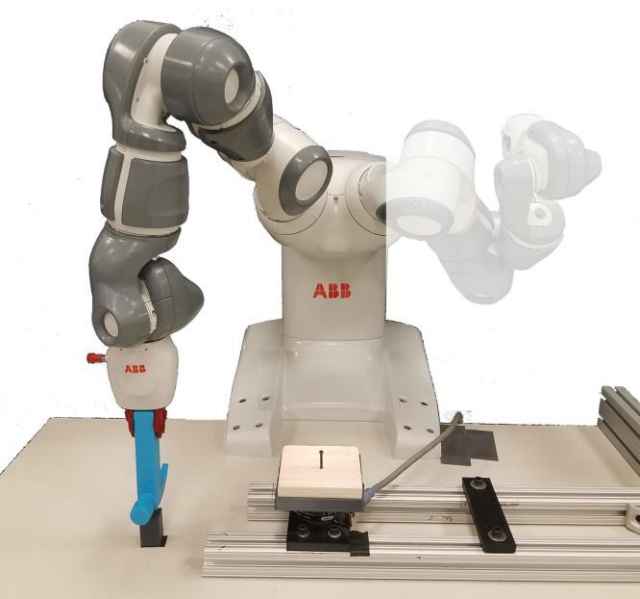
Our Work

3. Control liquid flow

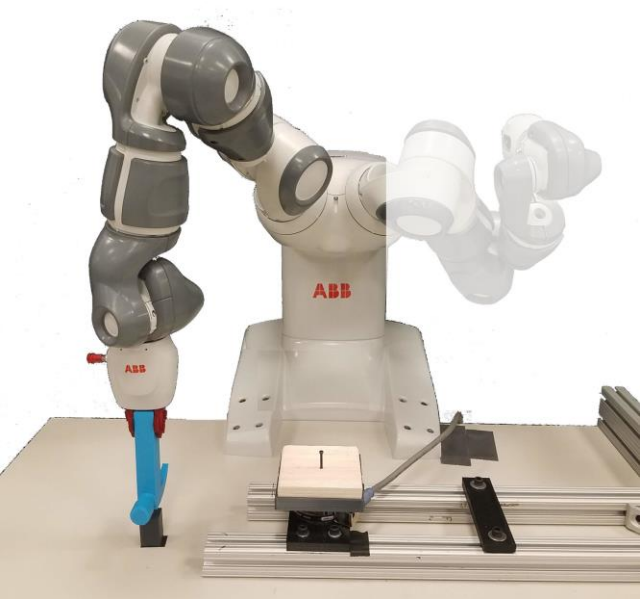
4. Enhance effectiveness of antagonistic displays

What does it mean to use a tool?

What does it mean to use a tool?

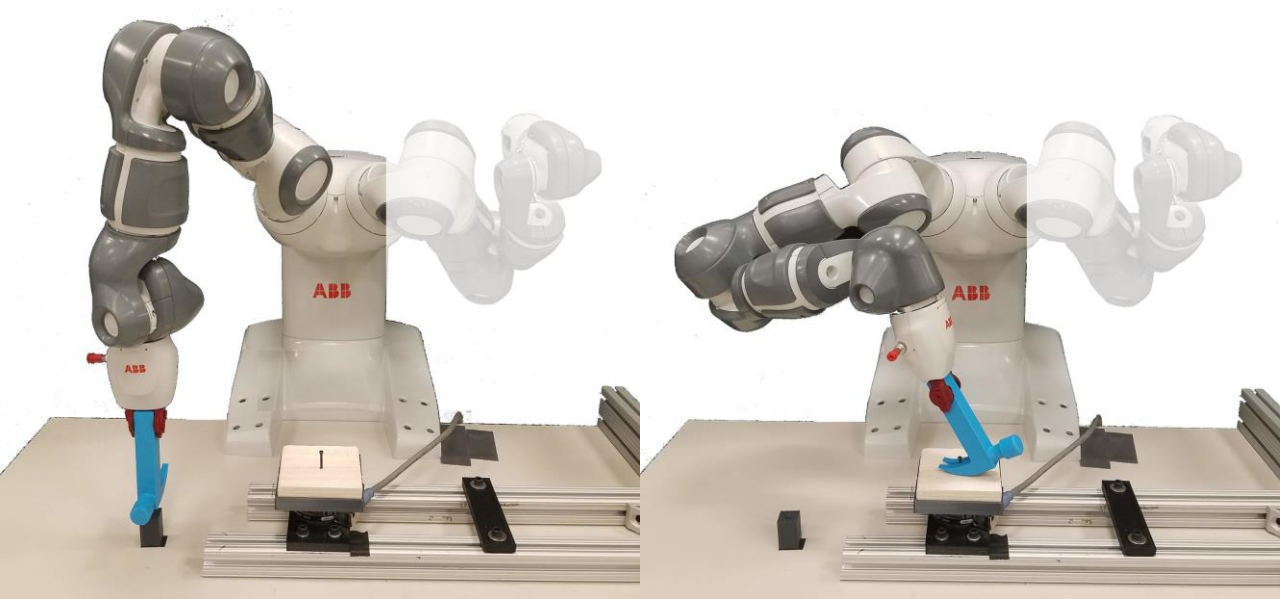


What does it mean to use a tool?



Grasp

What does it mean to use a tool?



Grasp

Engage

What does it mean to use a tool?

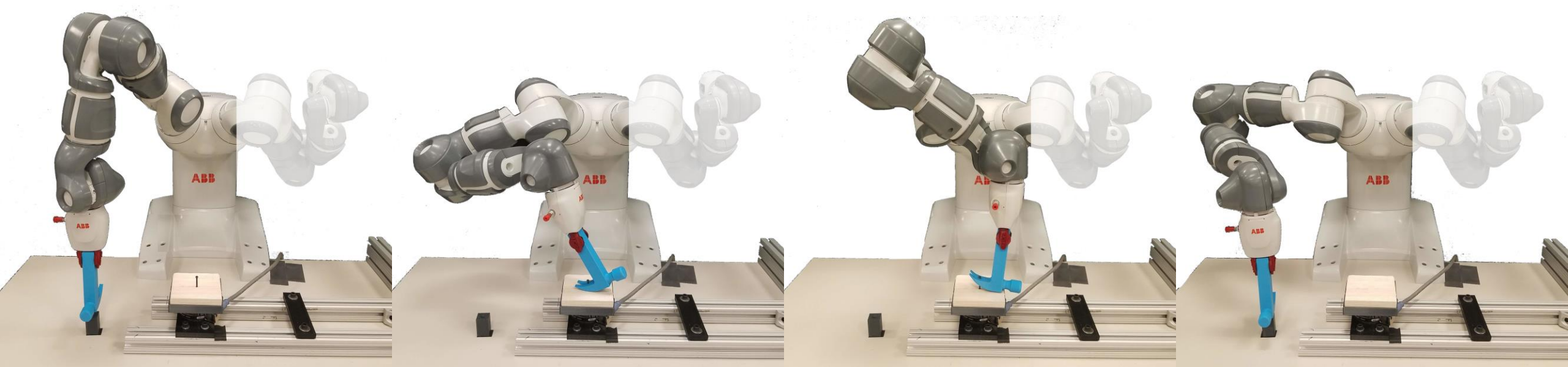


Grasp

Engage

Actuate

What does it mean to use a tool?



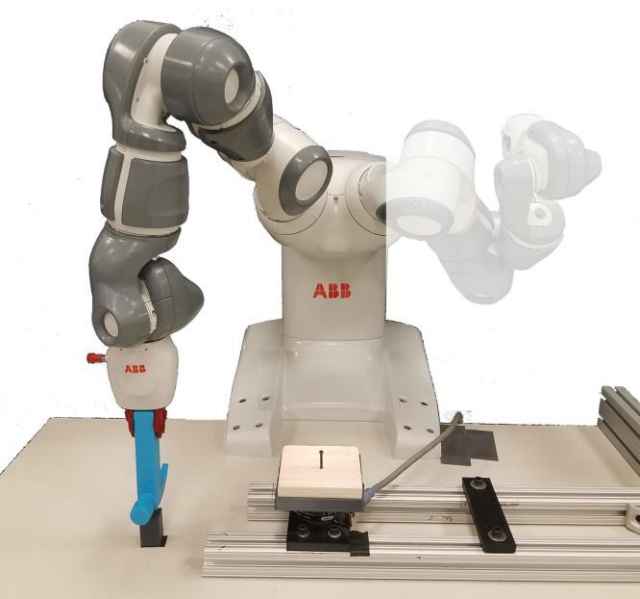
Grasp

Engage

Actuate

Place

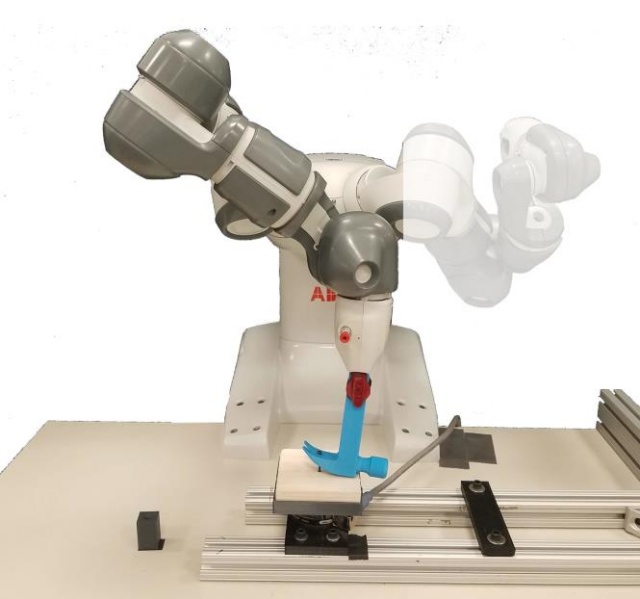
Existing Methods?



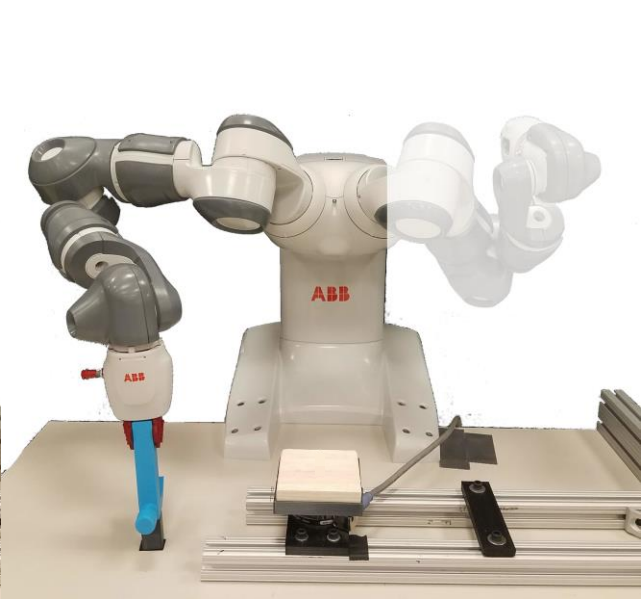
Grasp



Engage

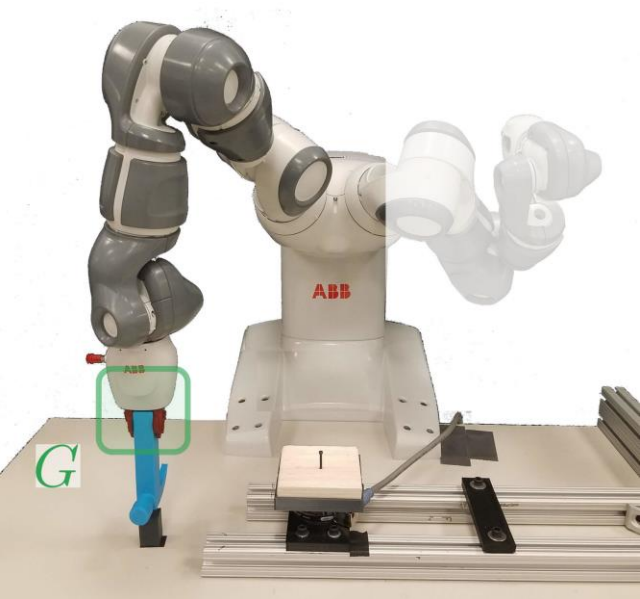


Actuate

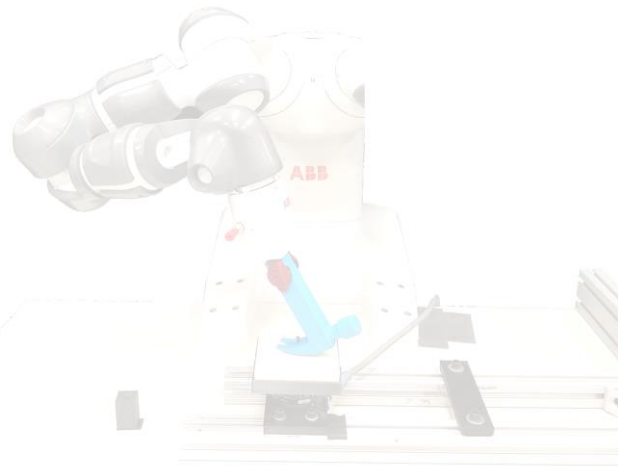


Place

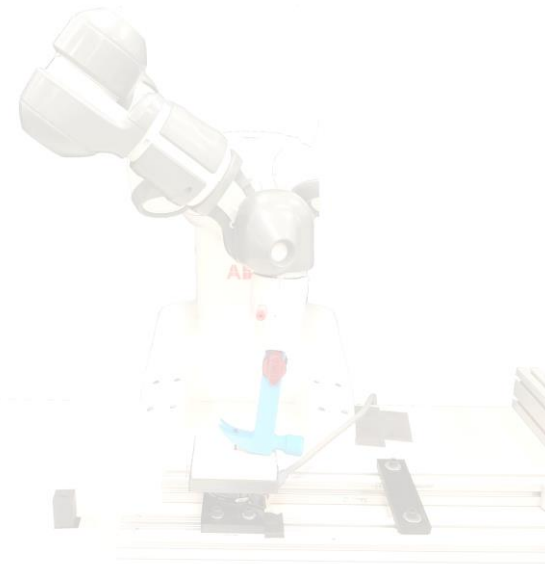
Existing Methods



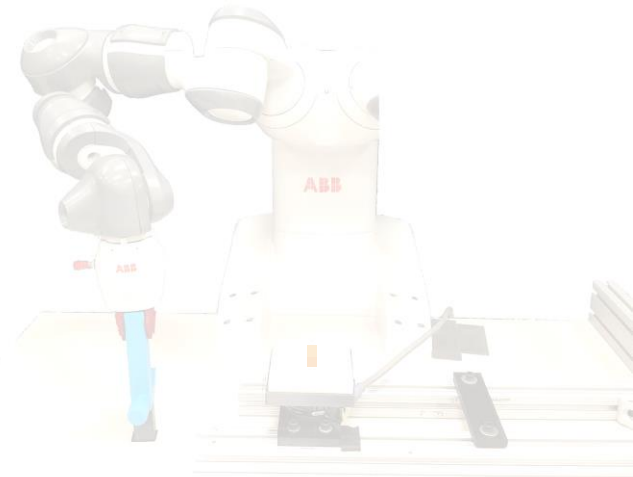
Grasp



Engage

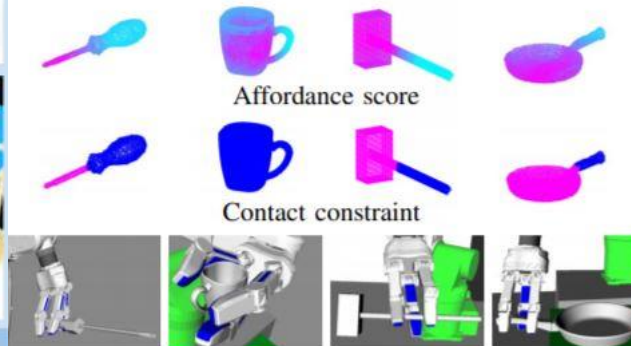
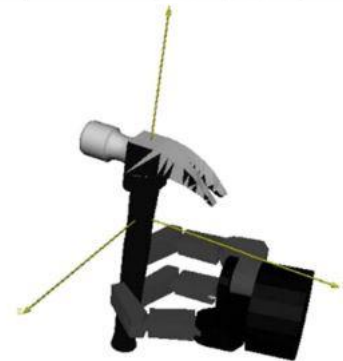
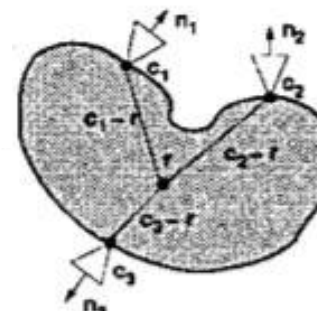
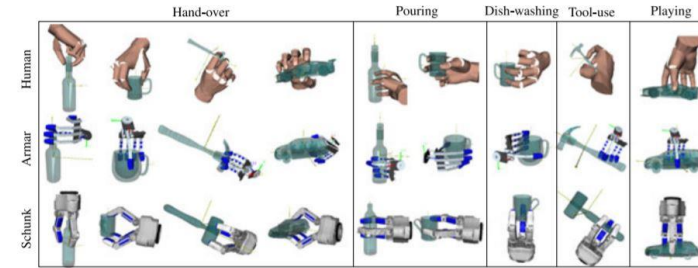
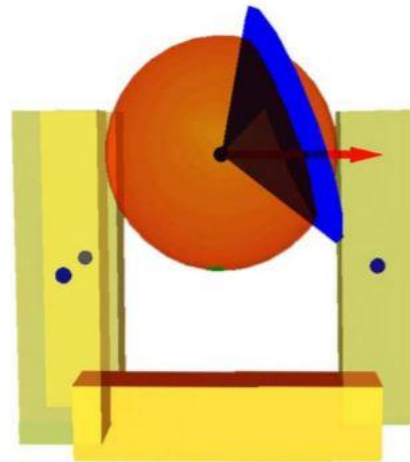
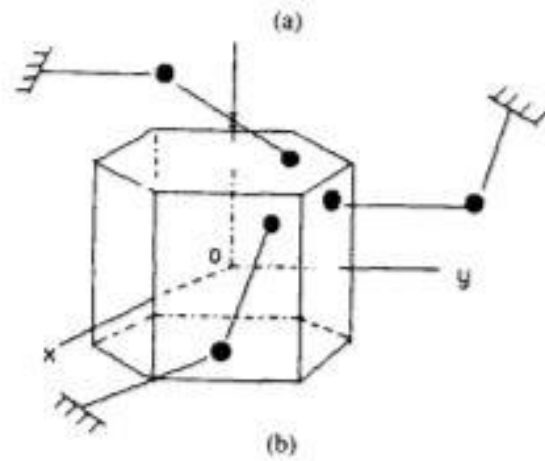
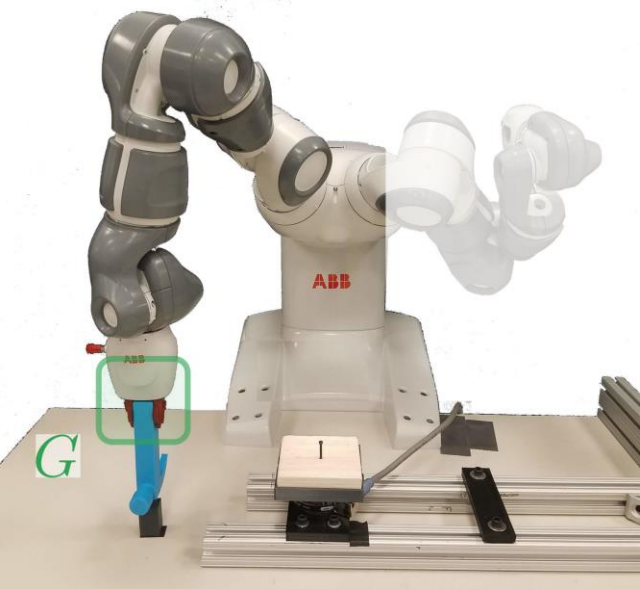


Actuate

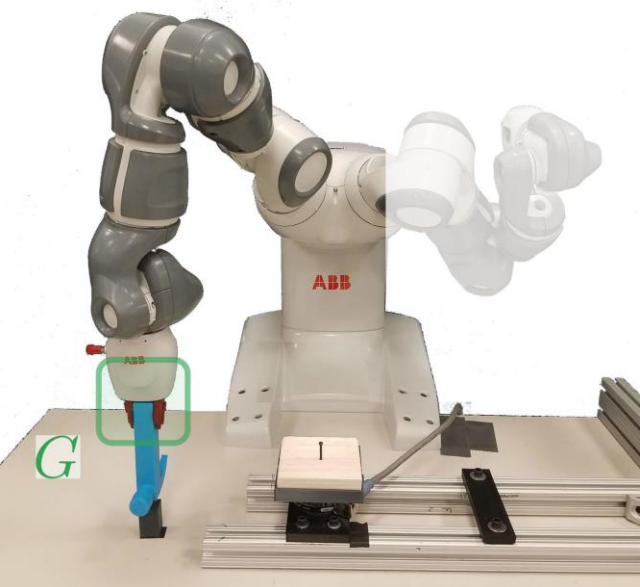


Place

Task-Oriented Grasping



Existing Methods



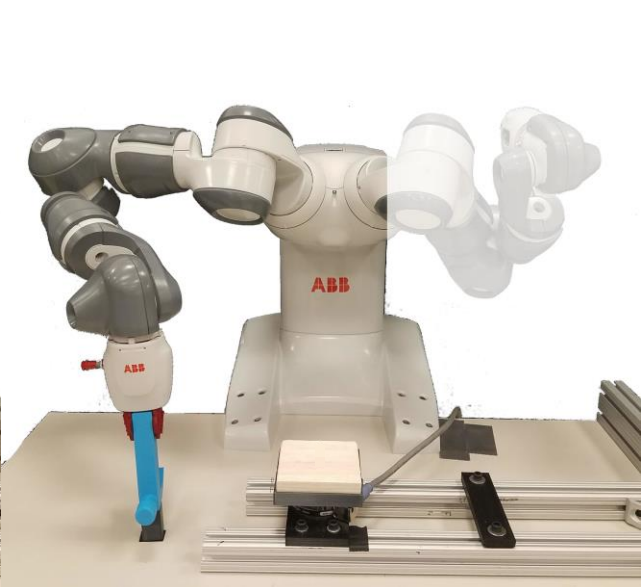
Grasp



Engage

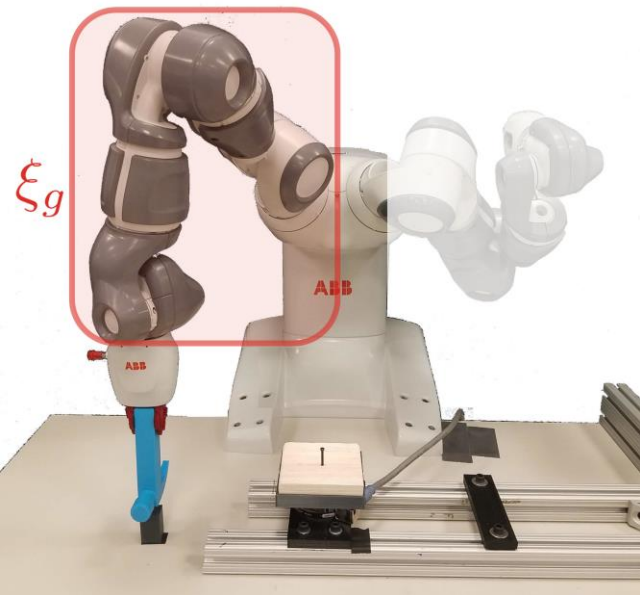


Actuate

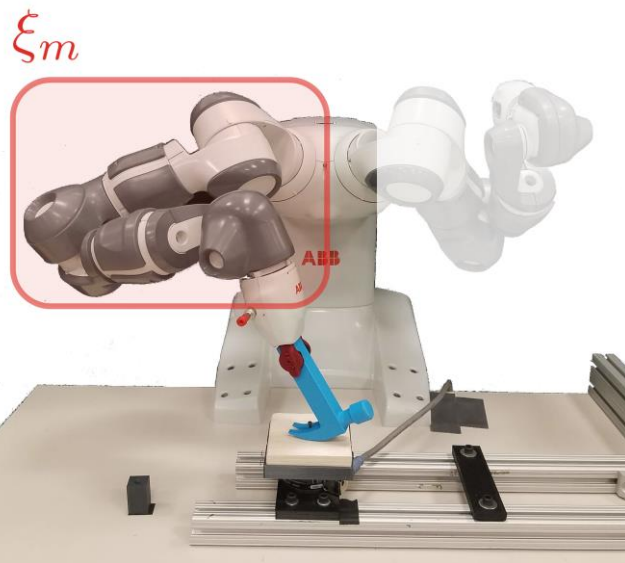


Place

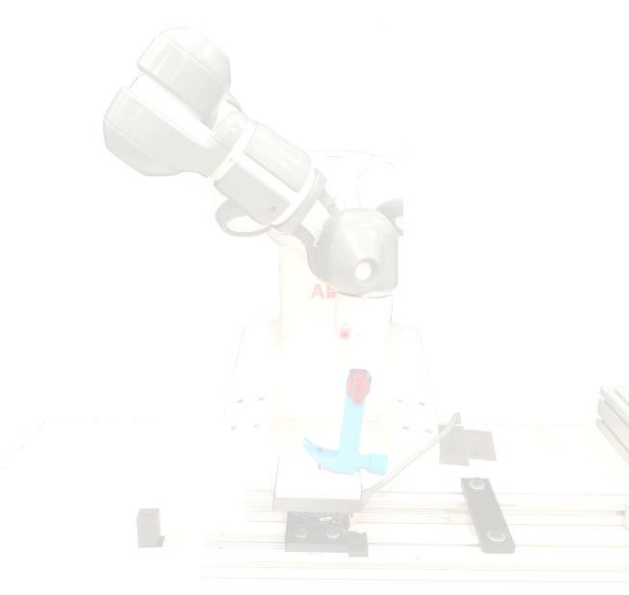
Existing Methods



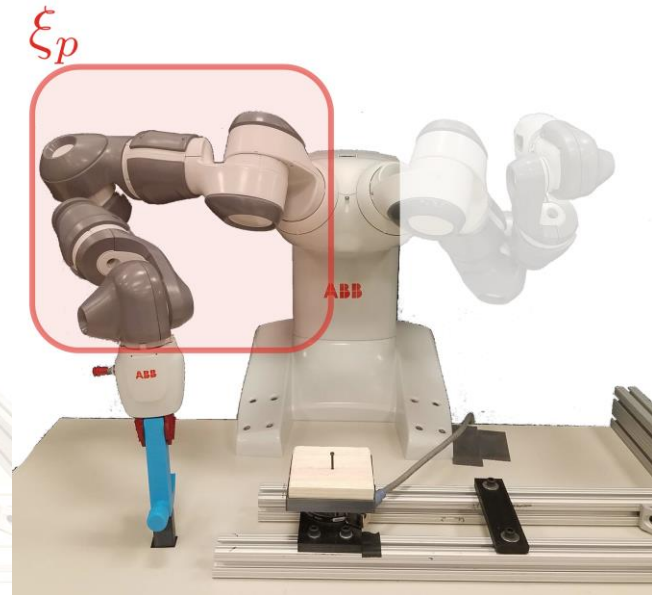
Grasp



Engage

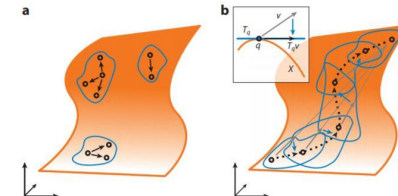
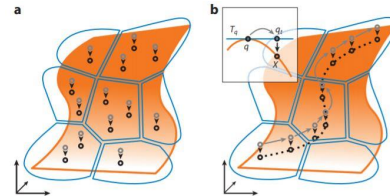
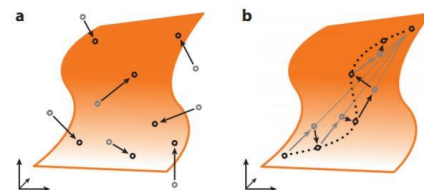
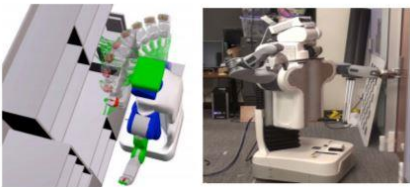
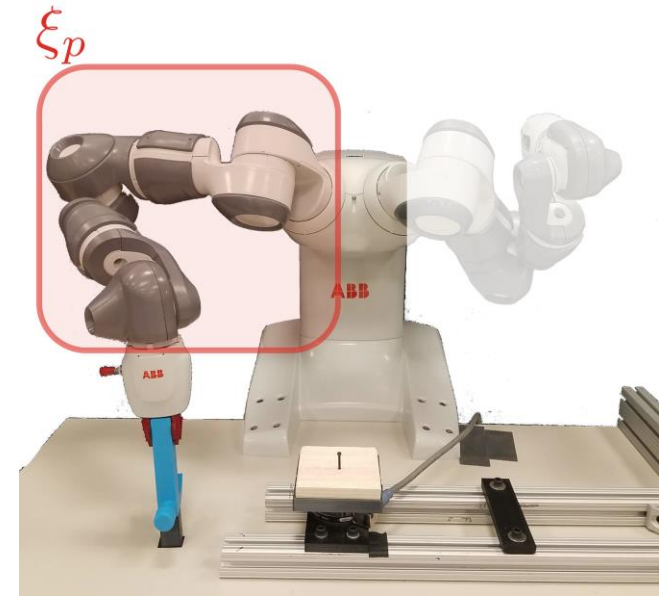
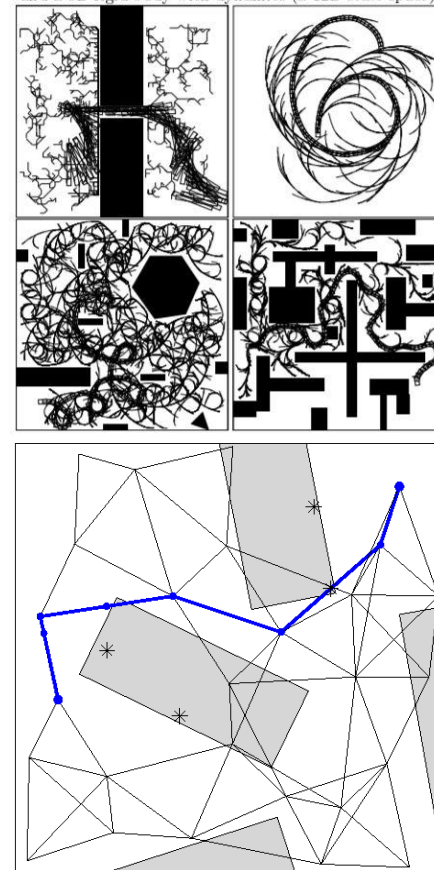
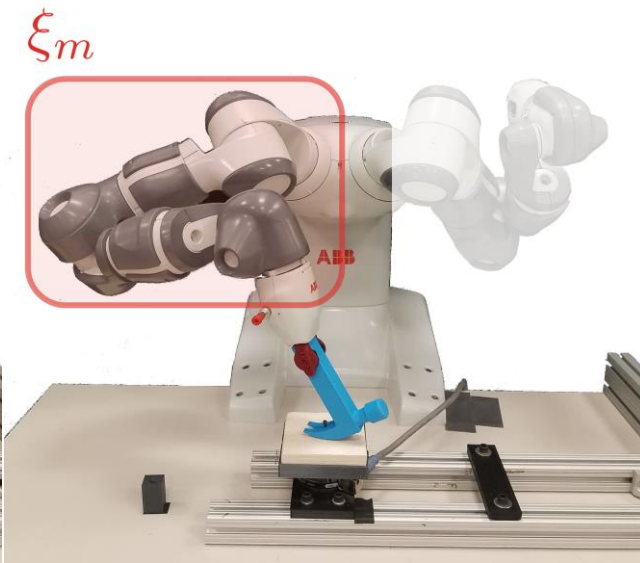
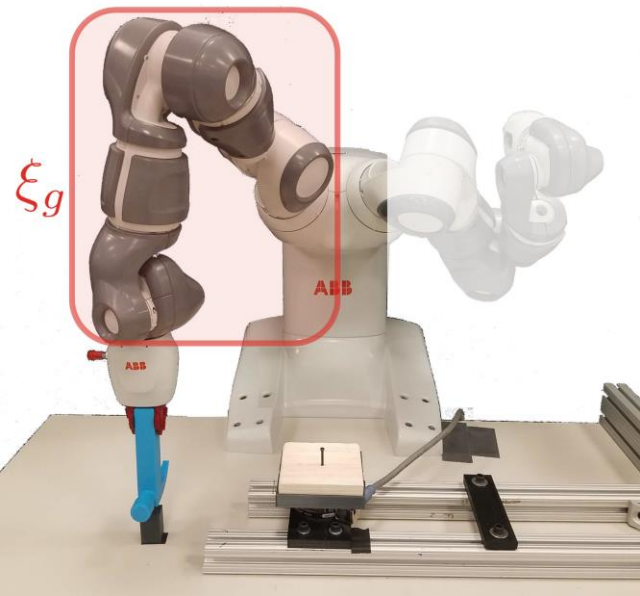


Actuate

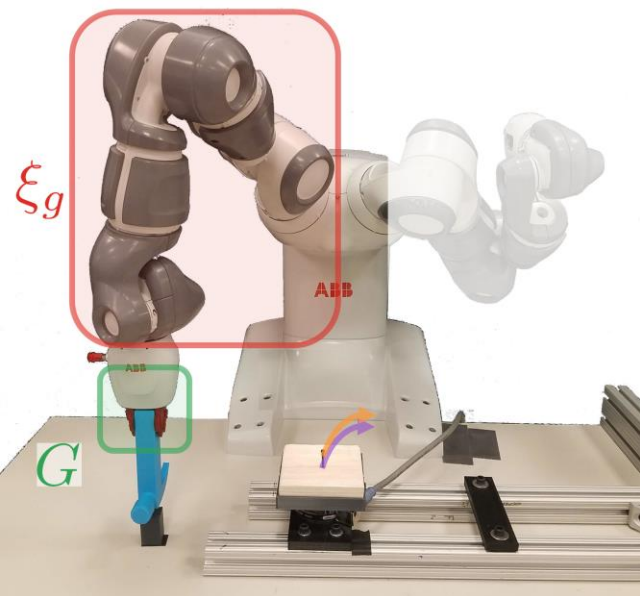


Place

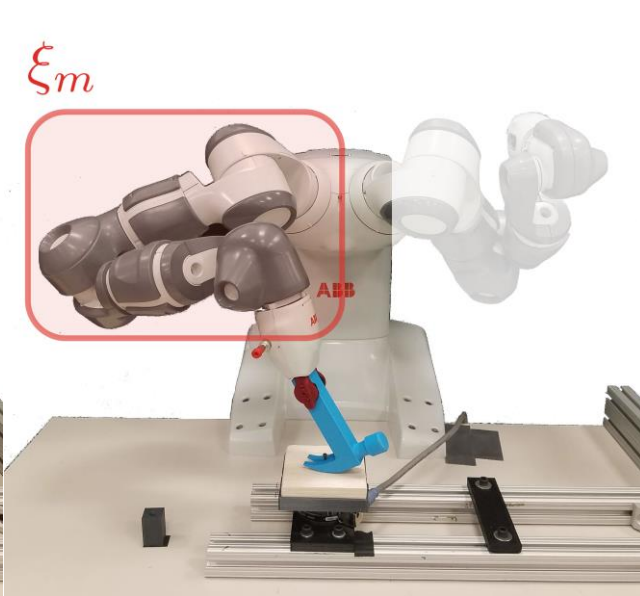
Collision-Free Planning



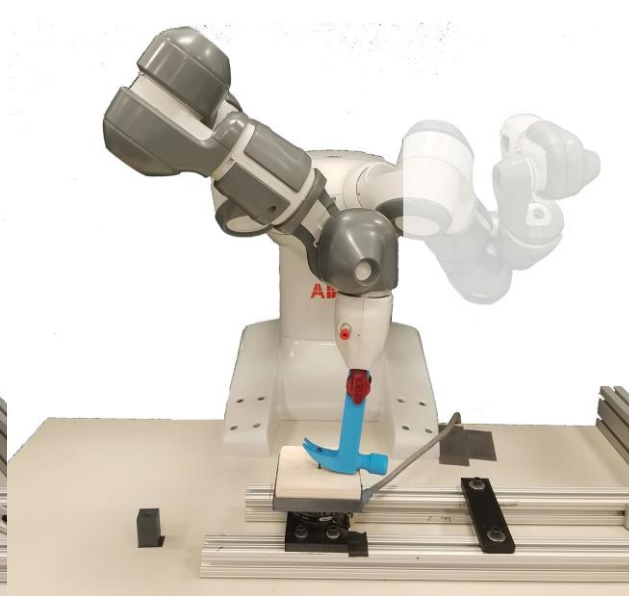
Existing Methods



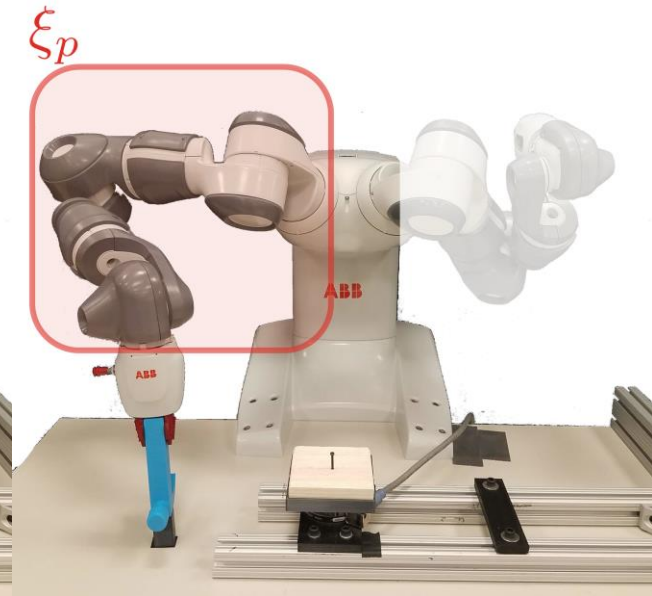
Grasp



Engage

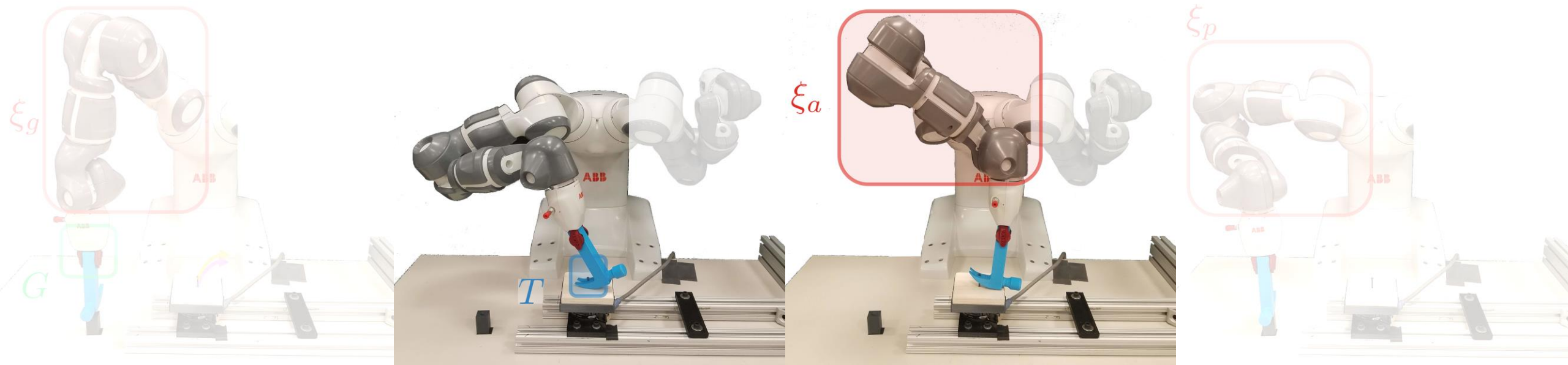


Actuate



Place

Existing Methods



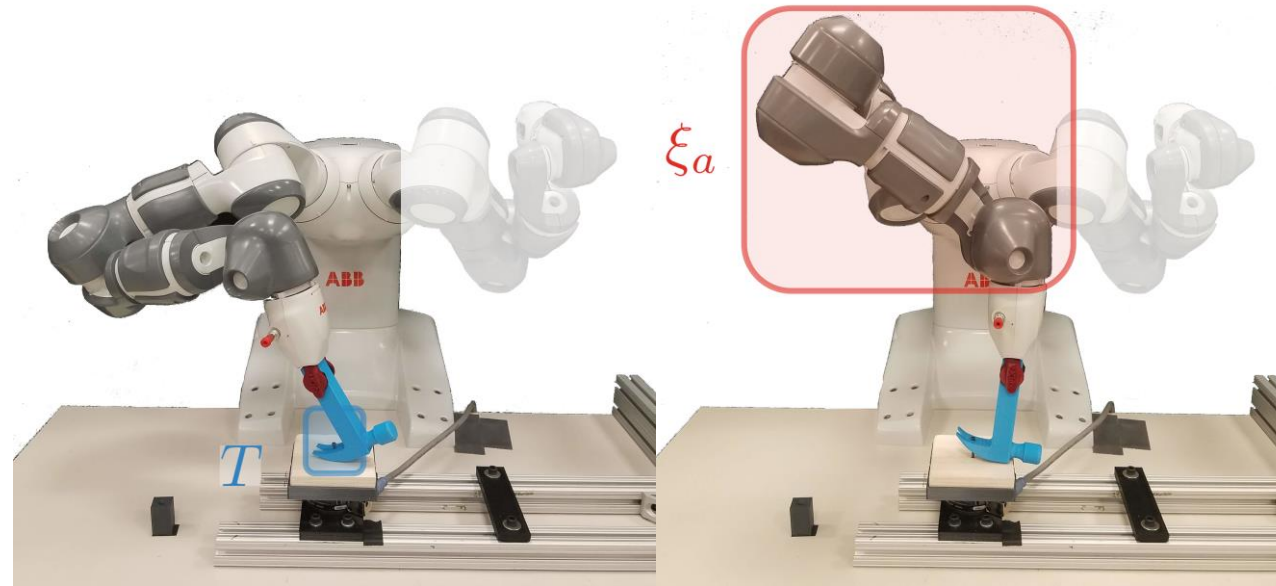
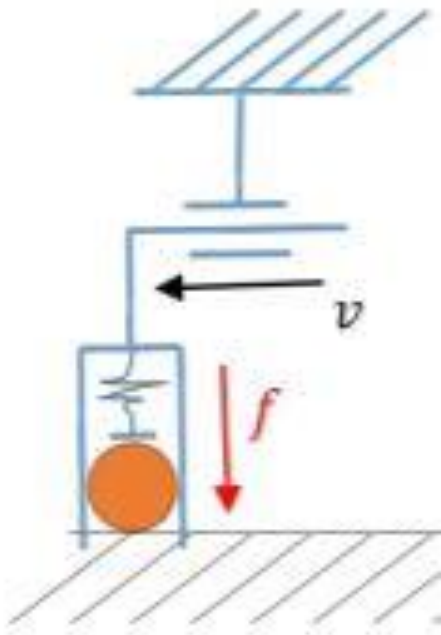
Grasp

Engage

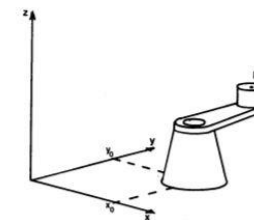
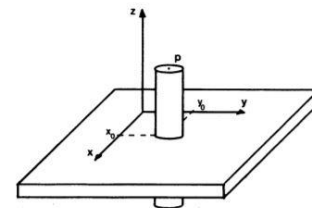
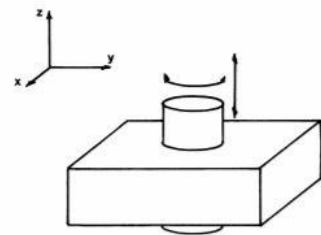
Actuate

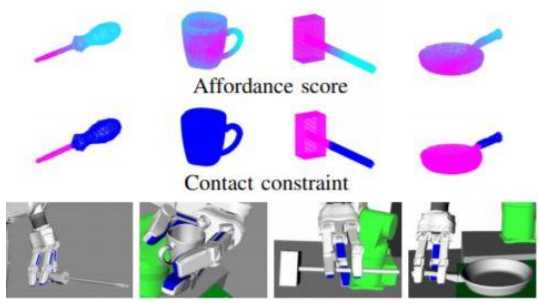
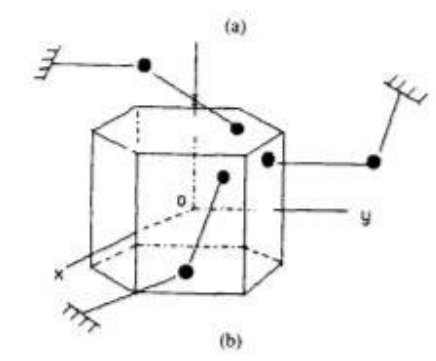
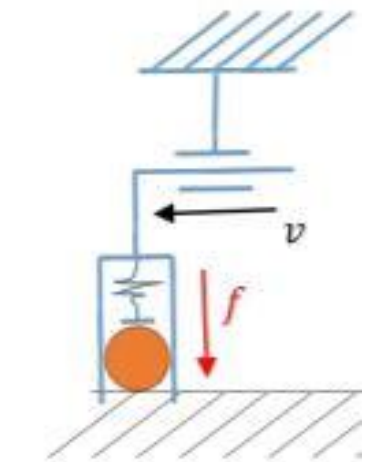
Place

Hybrid Position-Force Control

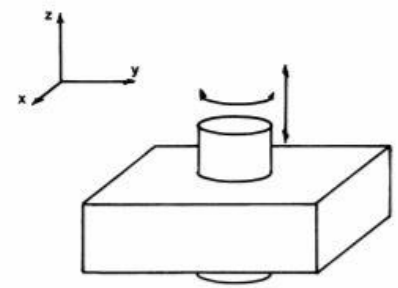
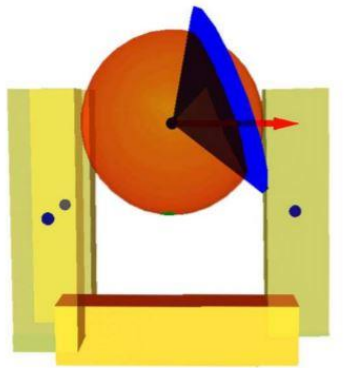
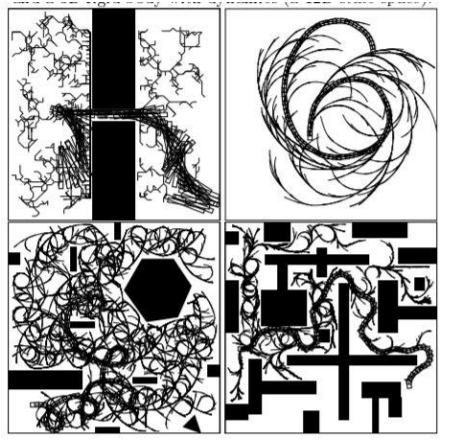
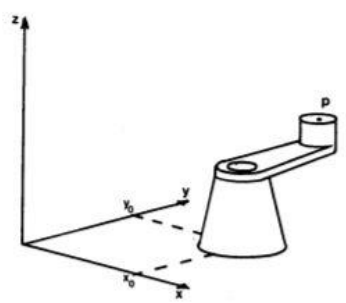


Move compliantly
 with task frame
 defined fixed to the end-effector,
 at the tip of the screwdriver
 with task-frame directions:
 x_t : force: 0 N
 y_t : velocity: 0 mm/s
 z_t : force: $-F$ N
 α_{x_t} : force: 0 N mm
 α_{y_t} : force: 0 N mm
 α_{z_t} : velocity: $-\omega$ rad/s
 with feedforward velocity frame equal to end-
 effector frame
 and feedforward velocity $(0,0,-pitch*\omega/2\pi,0,0,0)$
 until z_{ee} exceeds s mm
 and α_{z_t} force equals T N mm.



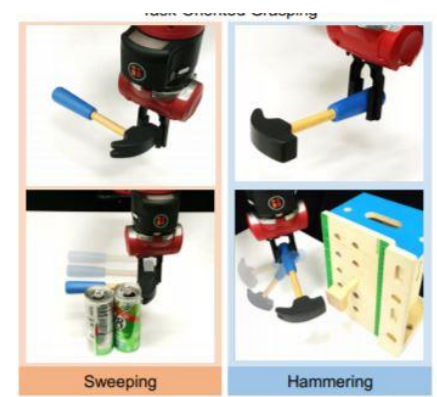
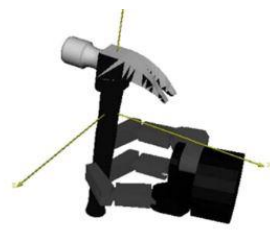
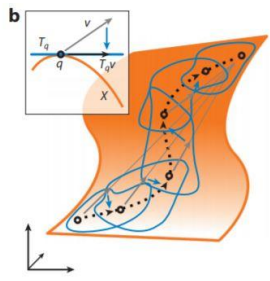
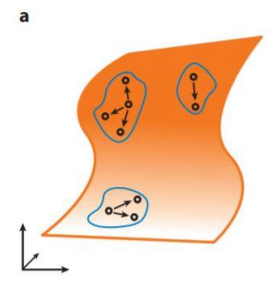
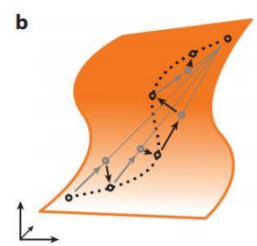
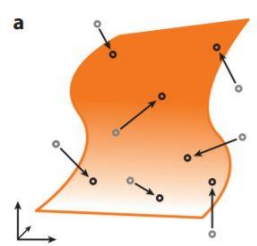
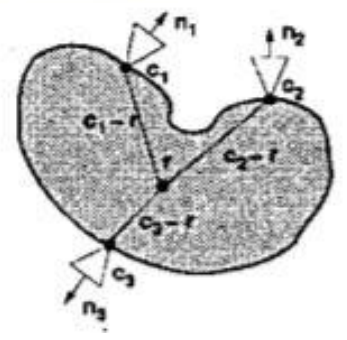
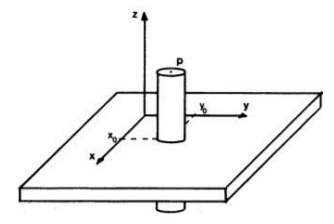
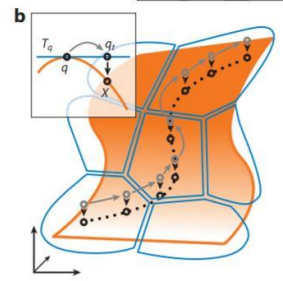
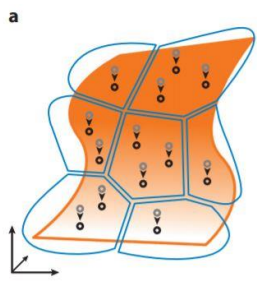


	Hand-over	Pouring	Dish-washing	Tool-use	Playing
Human					
Armarr					
Schunk					



Move compliantly with task frame defined fixed to the end-effector, at the tip of the screwdriver

- with task-frame directions:
- x_i : force: 0 N
- y_i : velocity: 0 mm/s
- z_i : force: $-F$ N
- α_{xy} : force: 0 N mm
- α_{yz} : force: 0 N mm
- α_{zx} : velocity: $-\omega$ rad/s
- with feedforward velocity frame equal to end-effector frame
- and feedforward velocity $(0, 0, -pitch \cdot \omega / 2\pi, 0, 0, 0)$
- until z_{ee} exceeds s mm
- and α_{xy} force equals T N mm.



Unifying Planning Framework

Affordance score

Contact constraint

	Handover	Pouring	Dishwashing	Tooluse	Playing
Human					
Arm					
School					

Move compliantly with task frame defined fixed to the end-effector, at the tip of the screwdriver

task frame directions:

- x : force: 0 N
- y : velocity: 0 mm/s
- z : force: $-F \text{ N}$
- α_x : force: 0 N mm
- α_y : force: 0 N mm
- α_z : velocity: $-\omega \text{ rad/s}$

with feedforward velocity frame equal to end-effector frame and feedforward velocity $(0,0,-\text{pitch}*\omega/2\pi,0,0,0)$ until z_e exceeds $s \text{ mm}$ and α_z force equals $T \text{ N mm}$.

Sweeping

Hammering

Unifying Planning Framework via Constraint Satisfaction

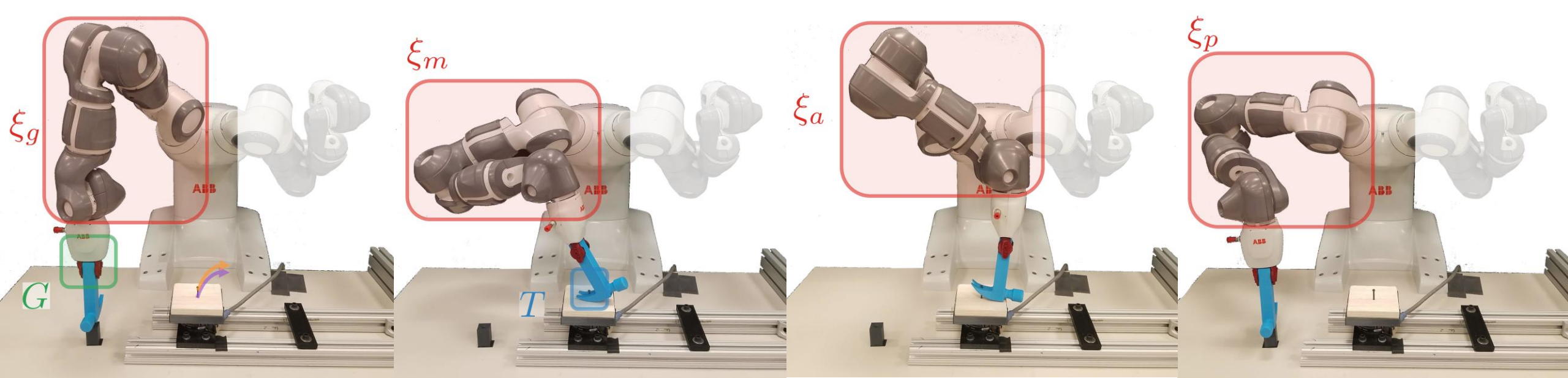


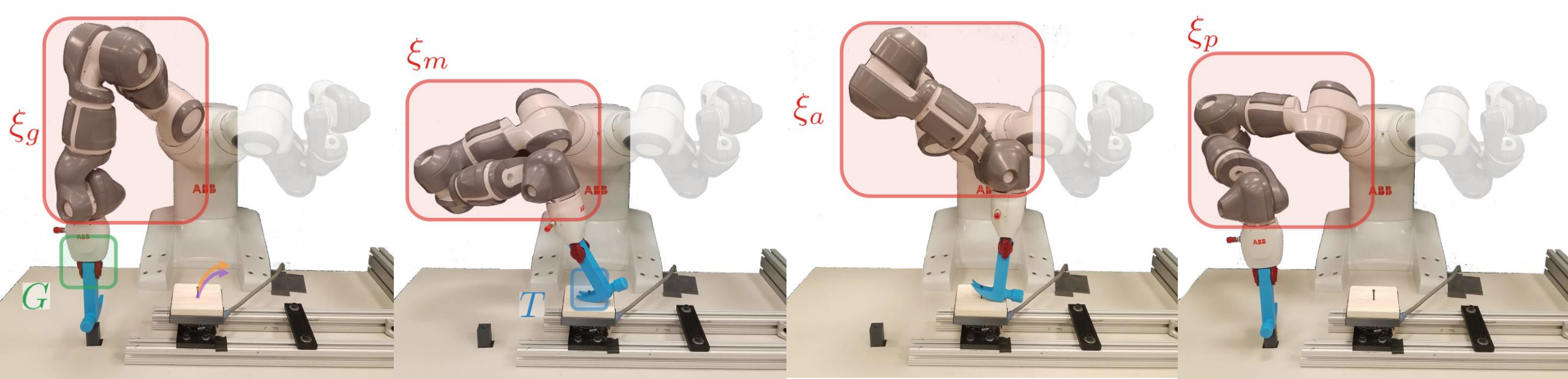
Move compliantly with task frame defined fixed to the end-effector, at the tip of the screwdriver

task frame directions:

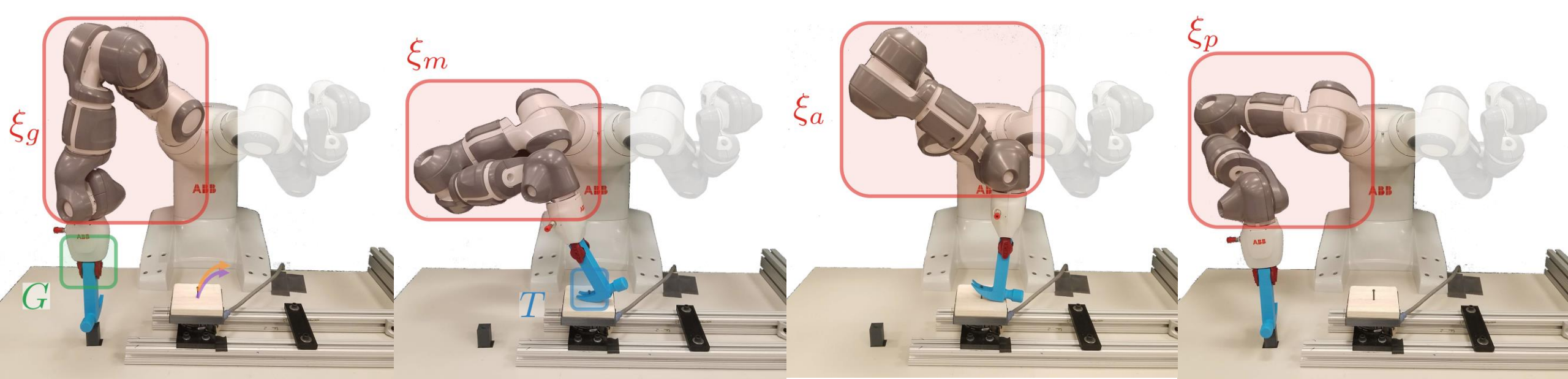
- x : force: 0 N
- y : velocity: 0 mm/s
- z : force: $-F\text{ N}$
- α_x : force: 0 N mm
- α_y : force: 0 N mm
- α_z : velocity: $-\omega\text{ rad/s}$

with feedforward velocity frame equal to end-effector frame and feedforward velocity $(0,0,-\text{pitch}*\omega/2\pi,0,0,0)$ until z_{tip} exceeds $s\text{ mm}$ and α_z force equals $T\text{ N mm}$.



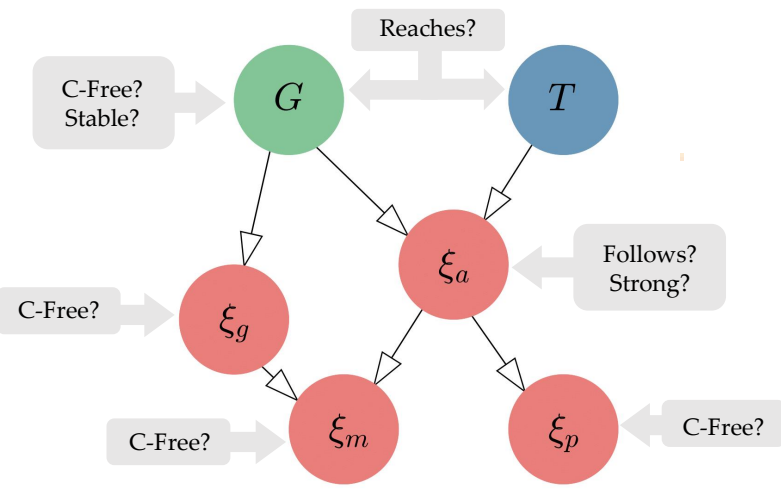


high-dimensional continuous **decision variables**

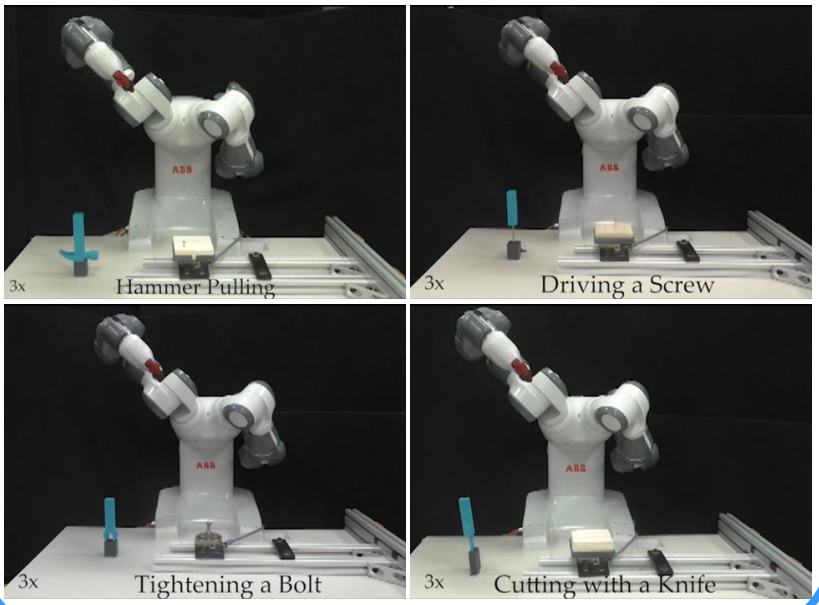


high-dimensional continuous **decision variables**
with **constraints** and **dependencies**

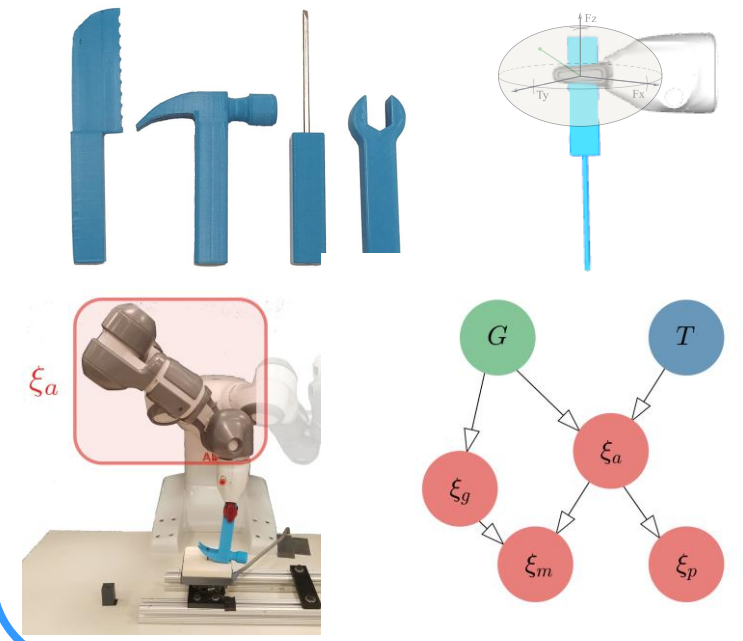
Constraints



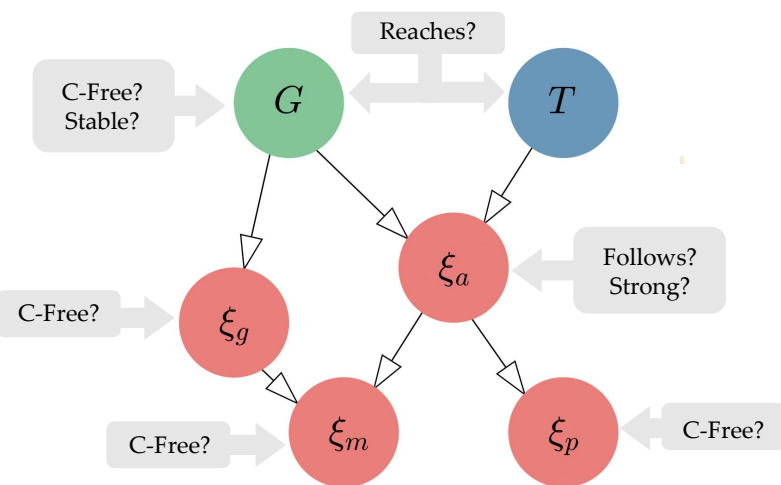
Experiments



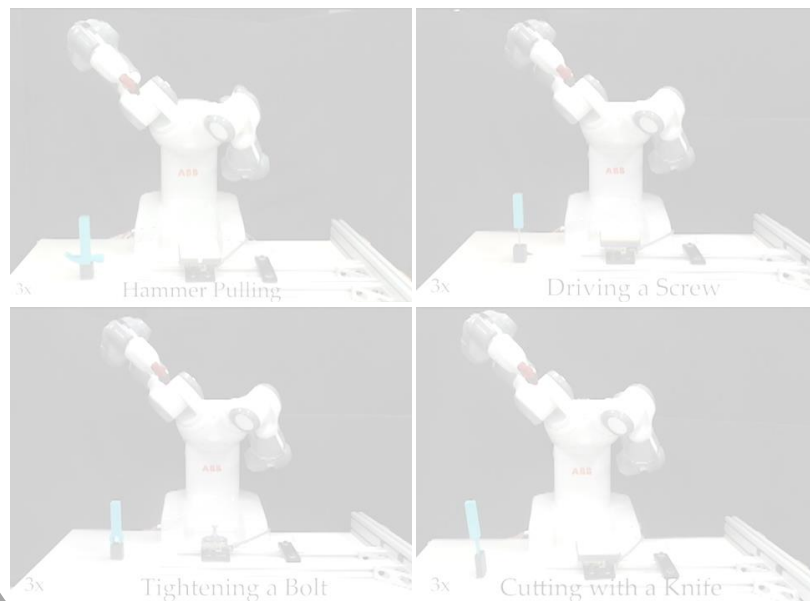
Assumptions



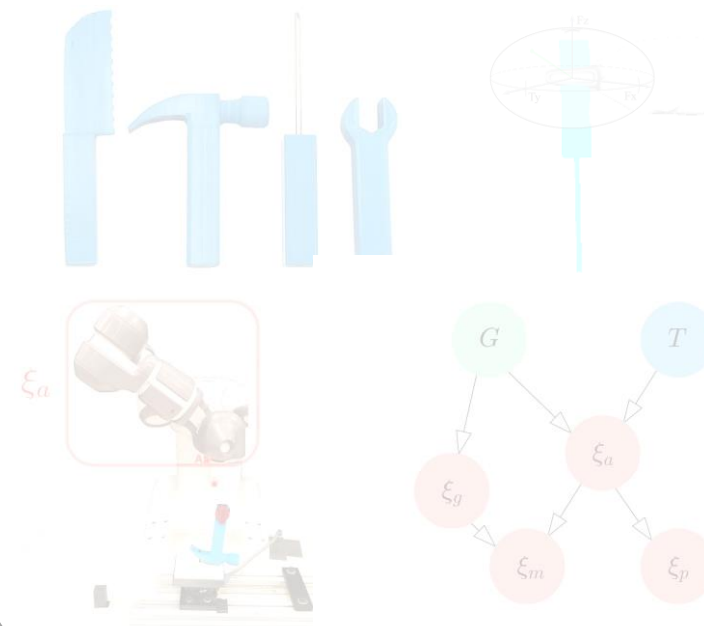
Constraints

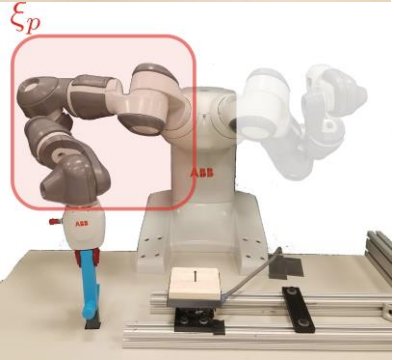
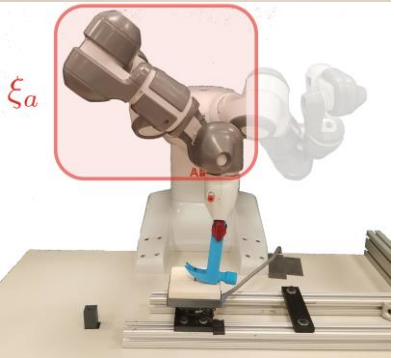
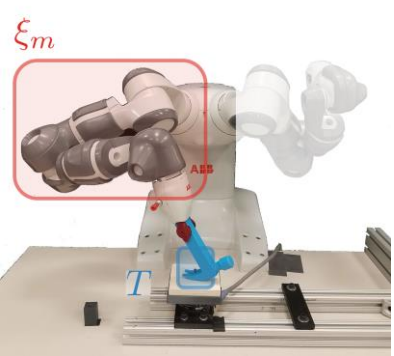
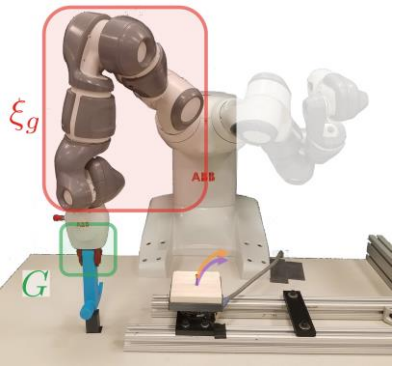


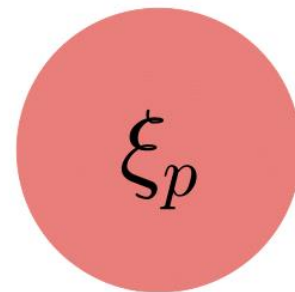
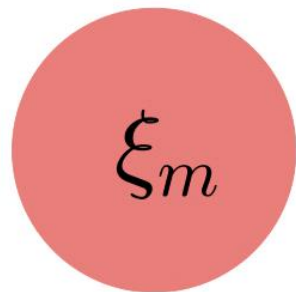
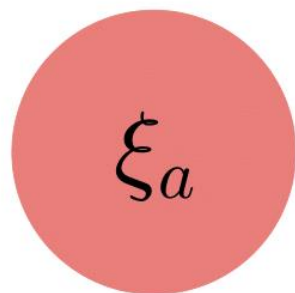
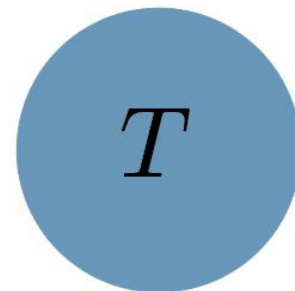
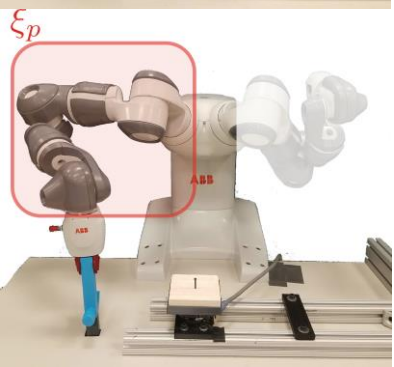
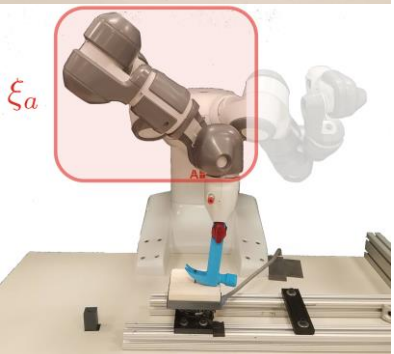
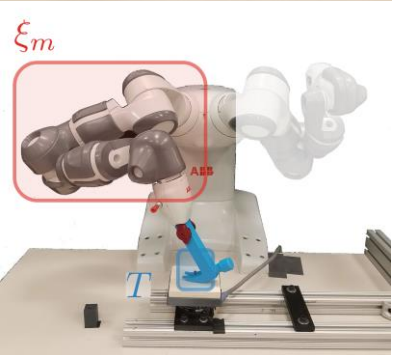
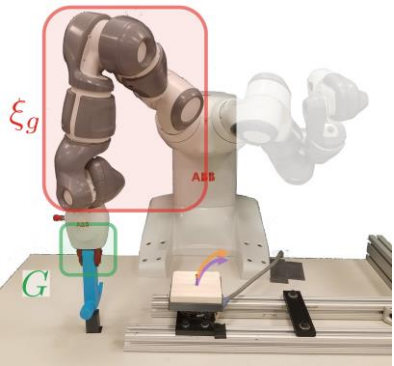
Experiments

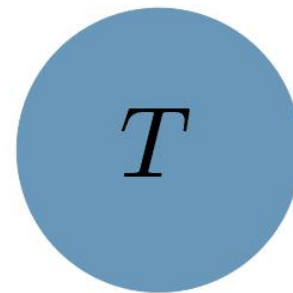
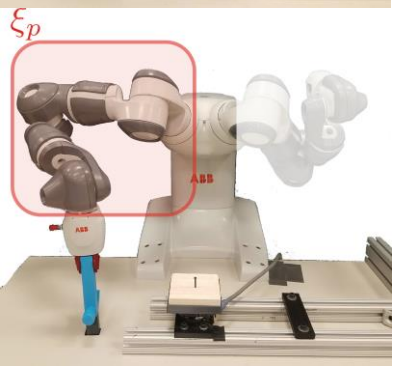
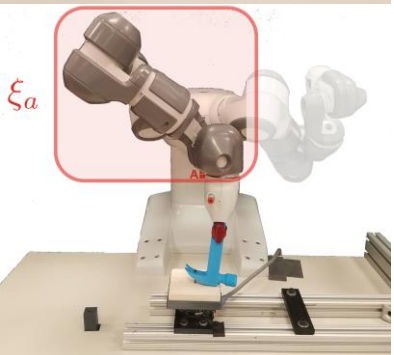
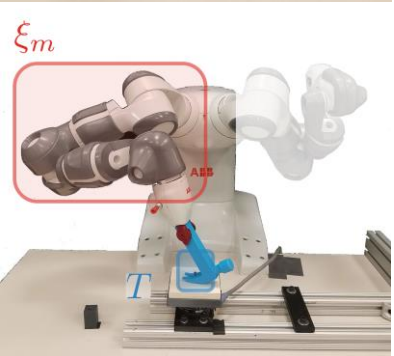
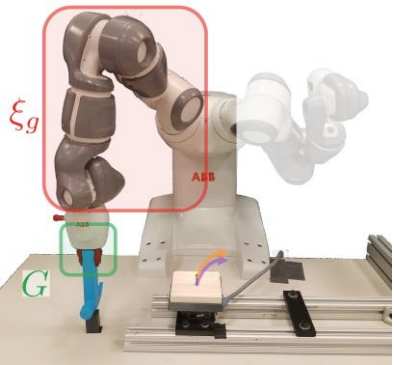


Assumptions

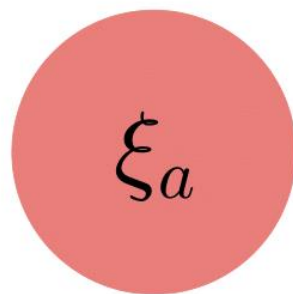




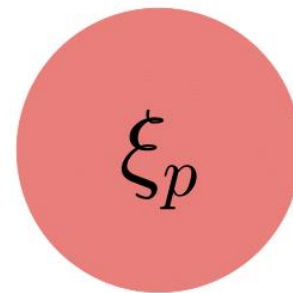
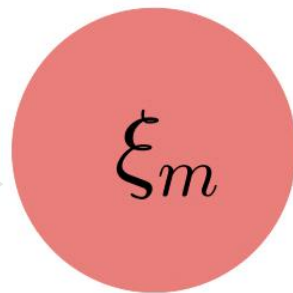




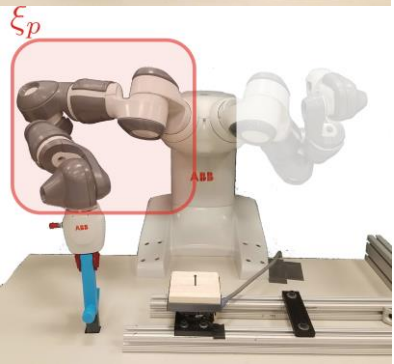
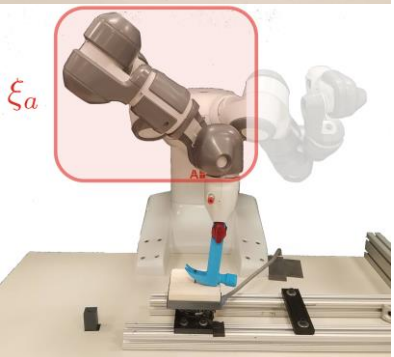
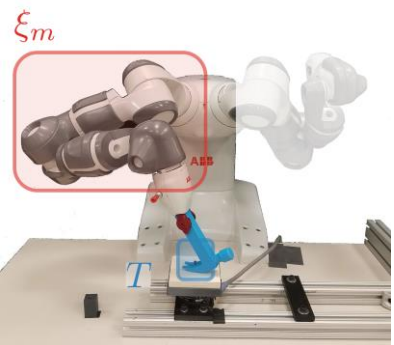
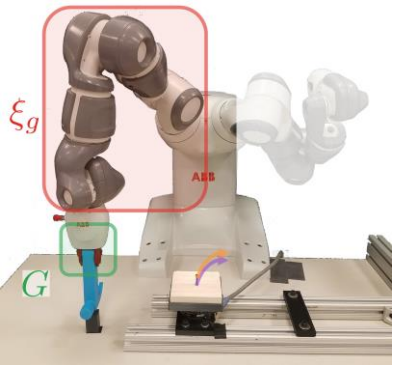
C-Free? →



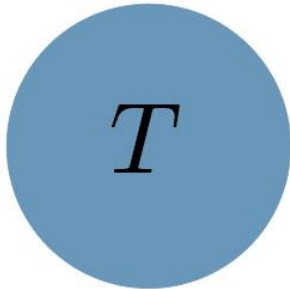
C-Free? →



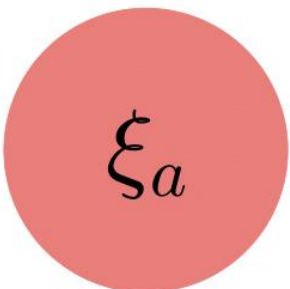
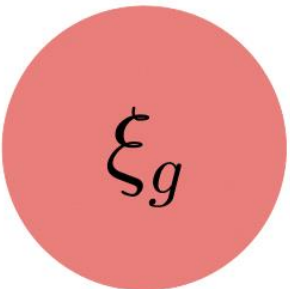
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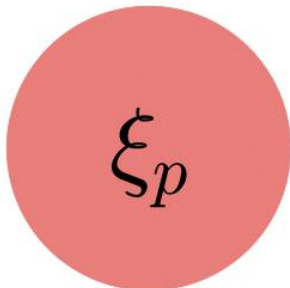
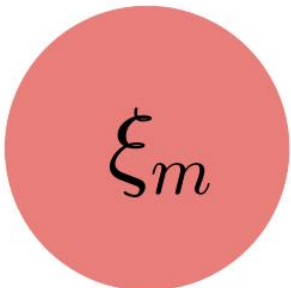
C-Free? →



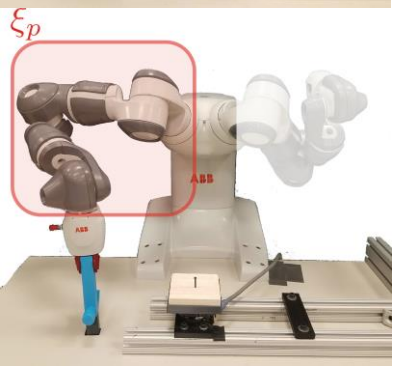
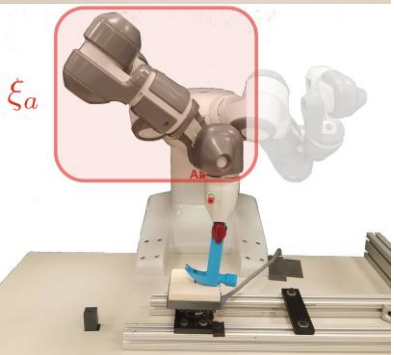
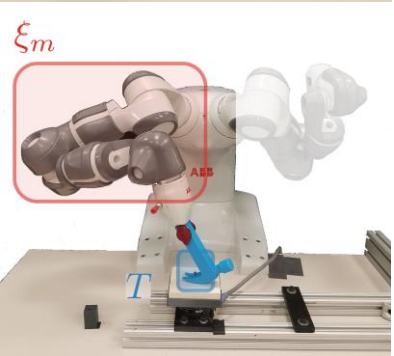
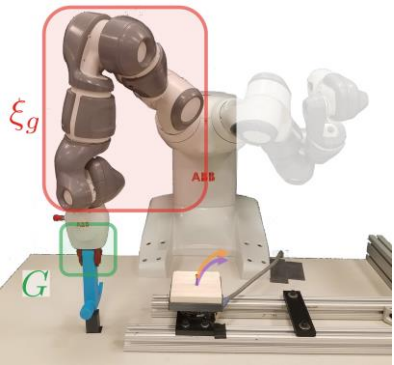
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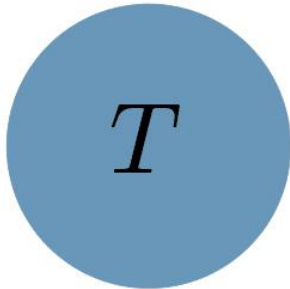
C-Free? →



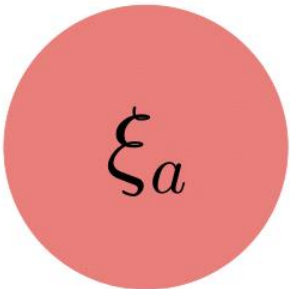
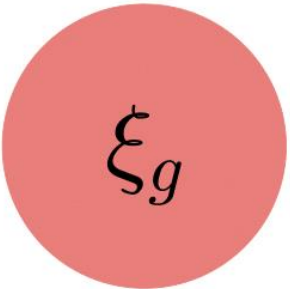
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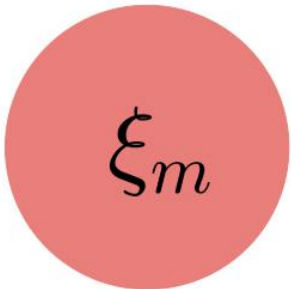
C-Free?
Stable?



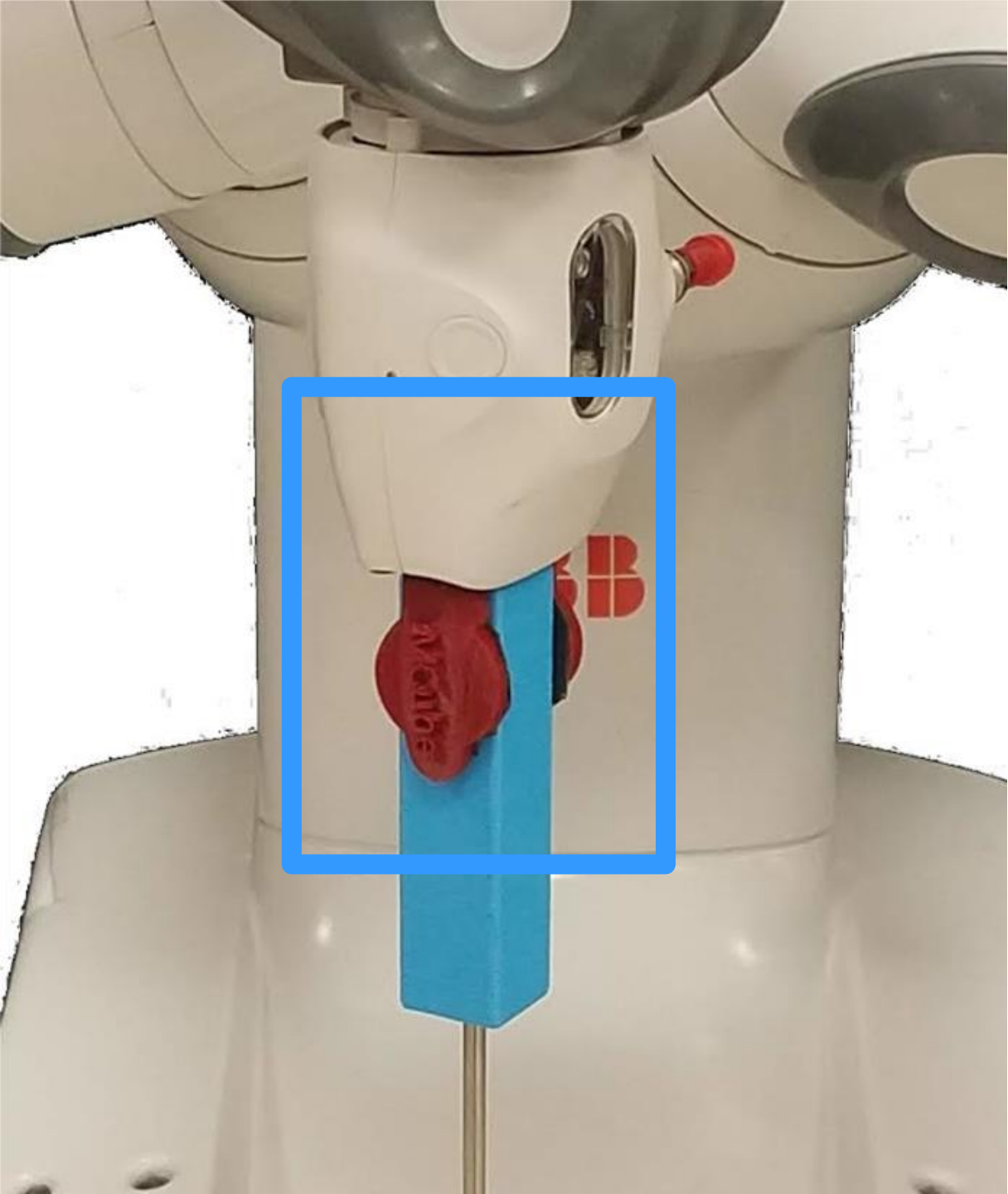
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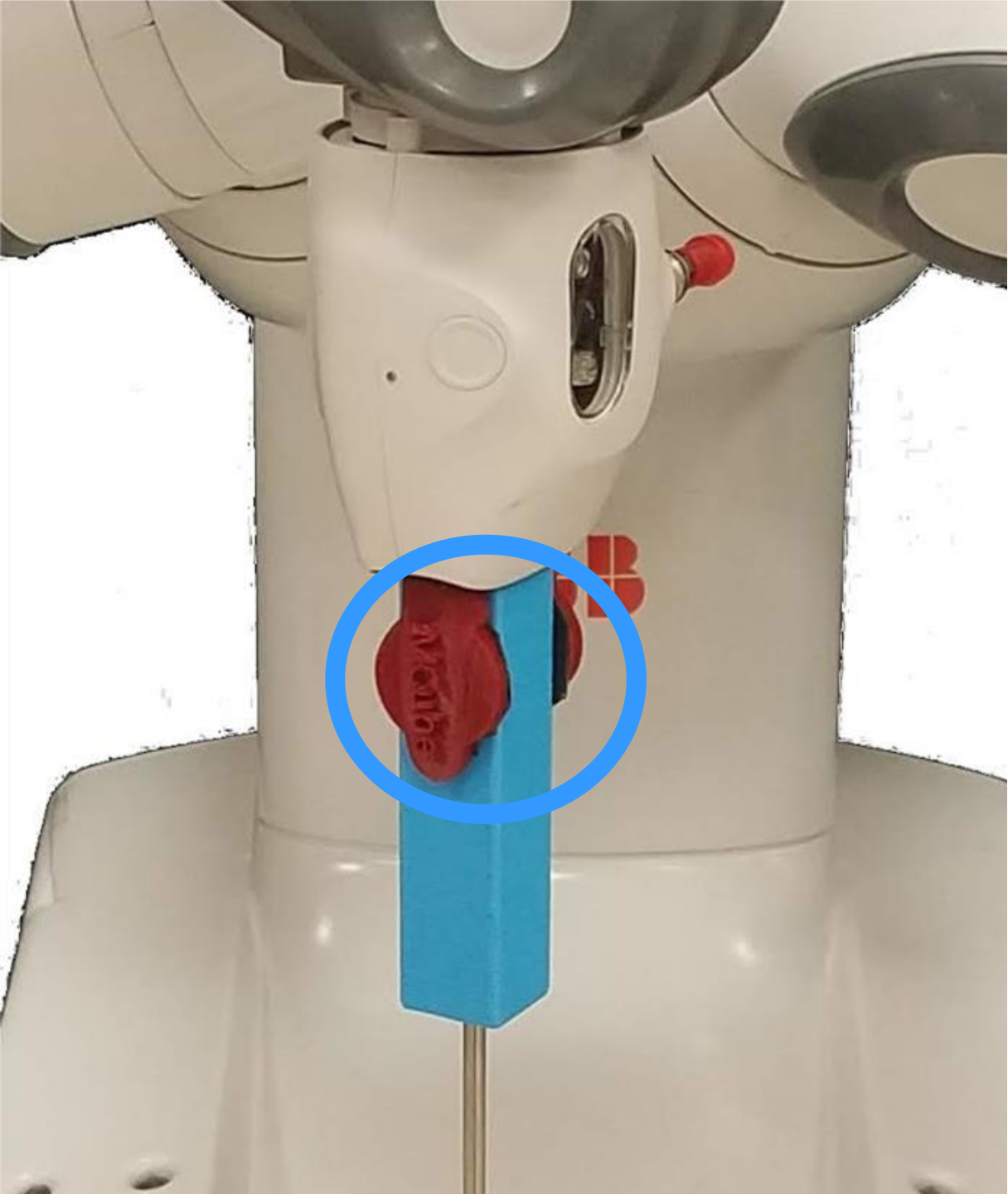
C-Free?



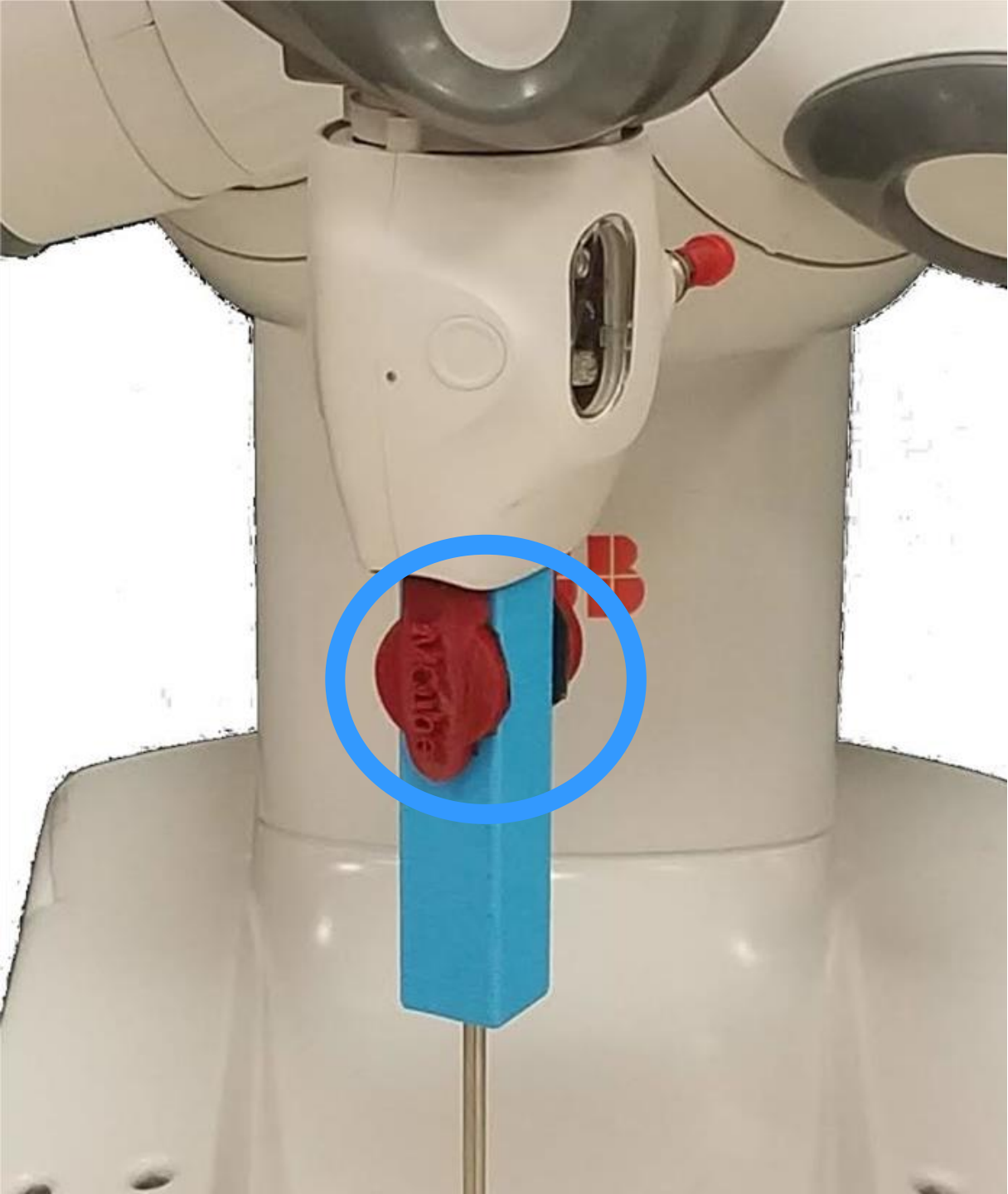
C-Free?



Frictional Joint



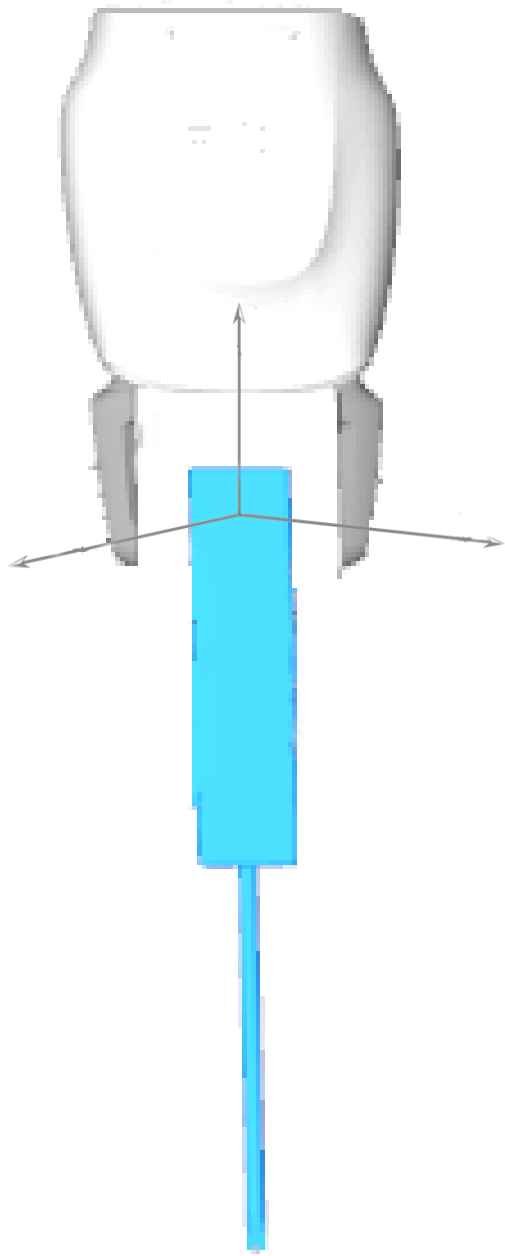
Planar Patch Contacts



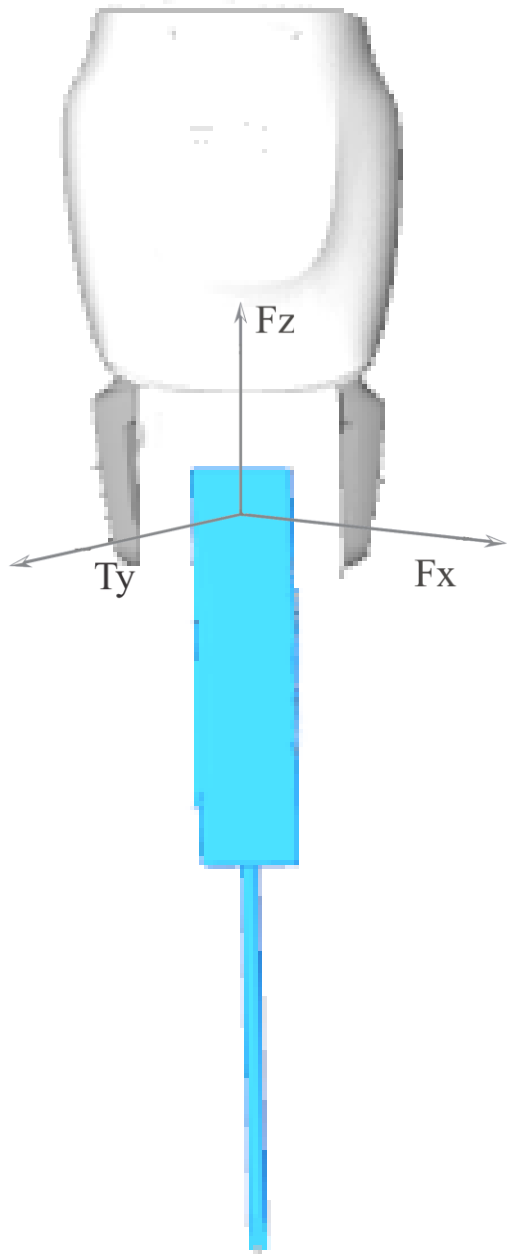
Planar Patch Contacts



Planar Patch Contacts

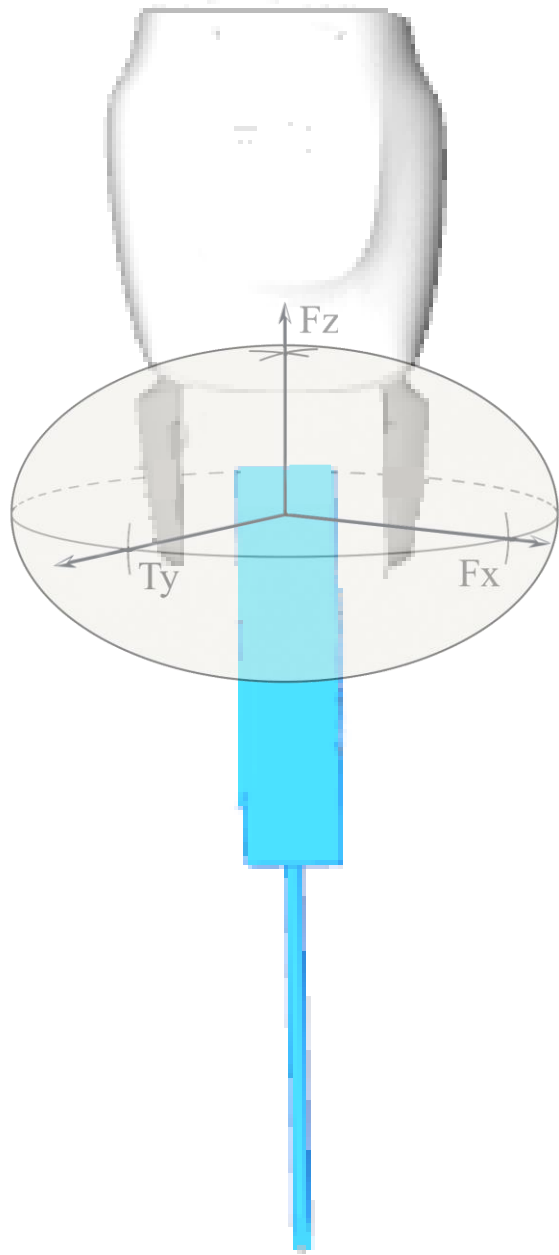


Contact Frame



What friction does the grasp offer?

Limit Surface

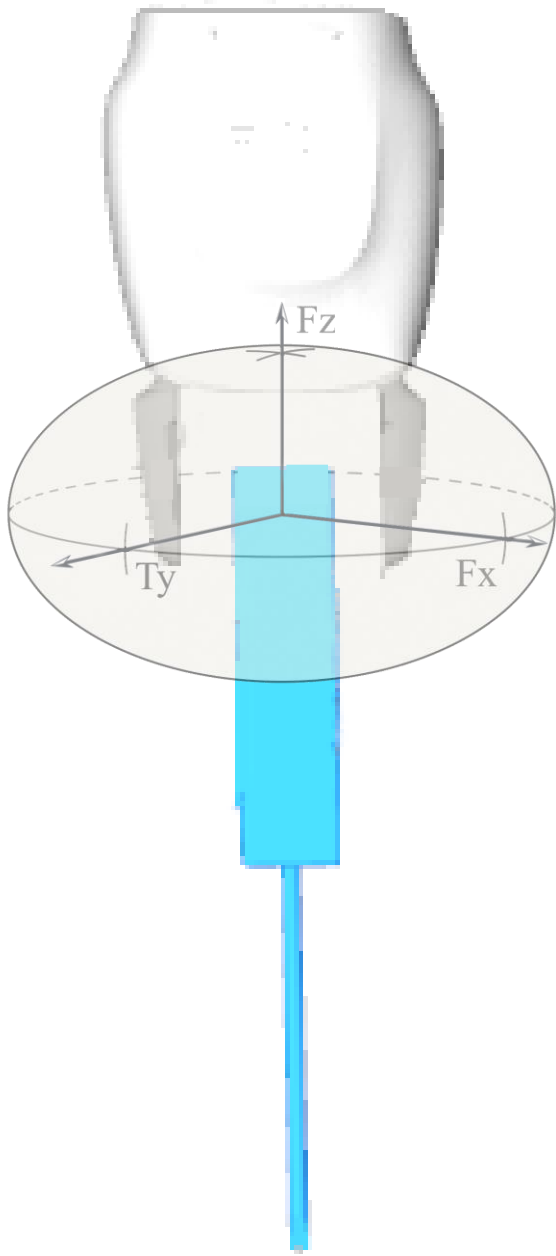


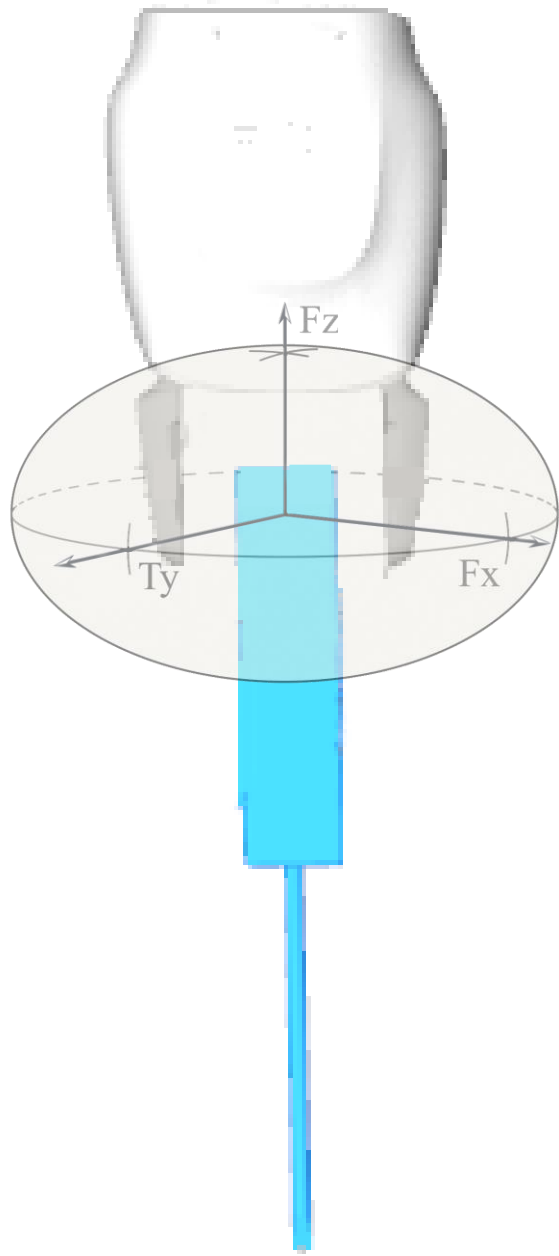
S. Goyal, A. Ruina, and J. Papadopoulos, "Planar sliding with dry friction part 1. limit surface and moment function," *Wear*, 1991

N. Xydas and I. Kao, "Modeling of contact mechanics and friction limit surfaces for soft fingers in robotics, with experimental results," *IJRR*, 1999.

Limit Surface

$$w = (f_x, f_z, t_y)$$

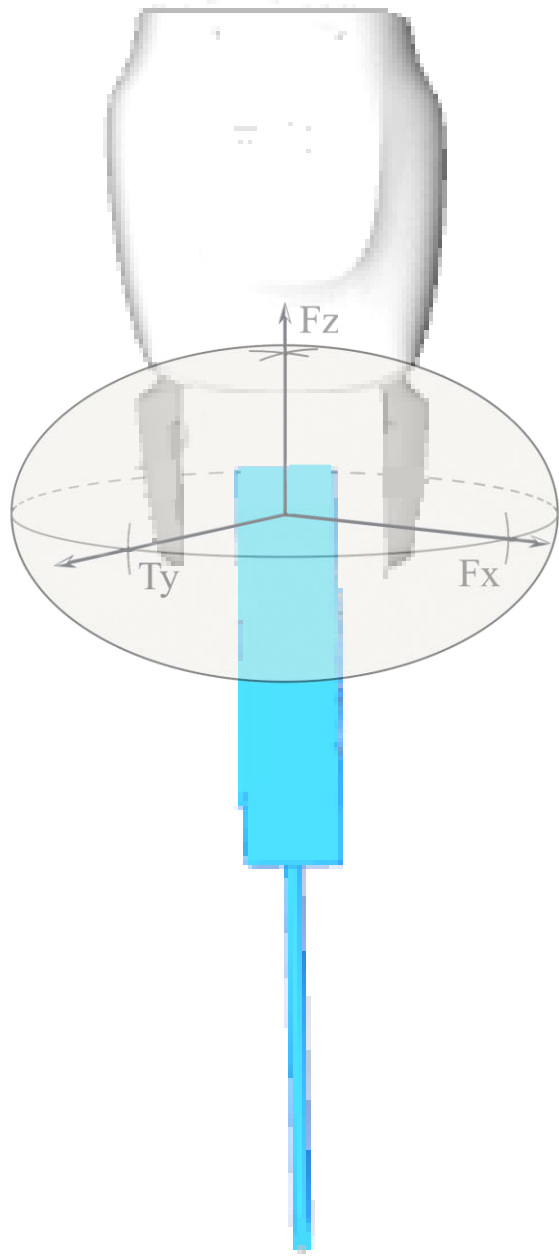




Limit Surface

$$w = (f_x, f_z, t_y)$$

$$w^T A w = 1$$

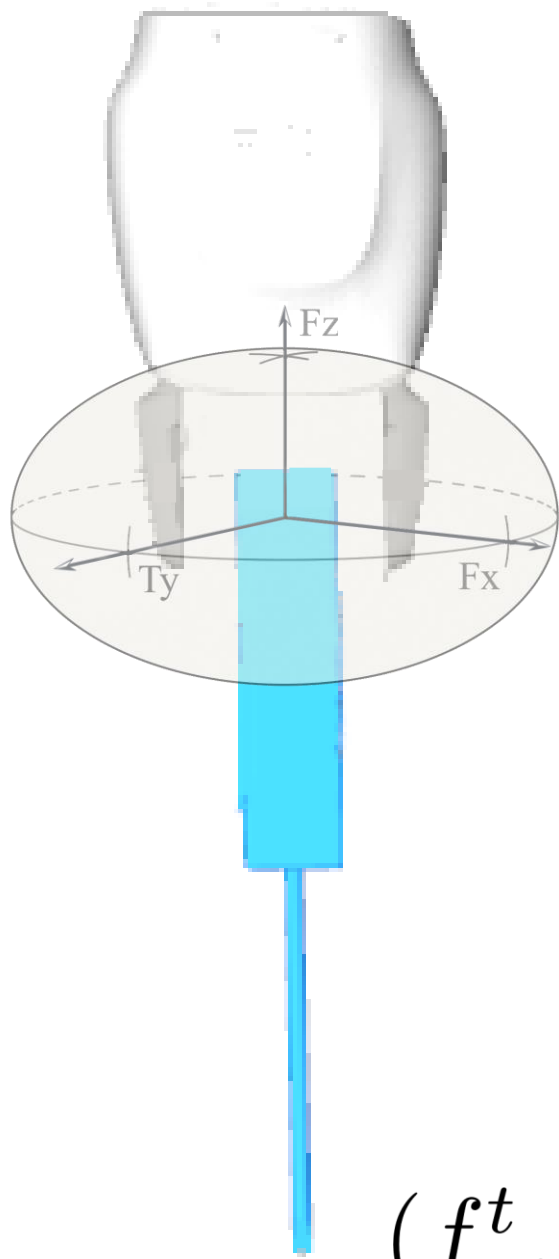


Limit Surface

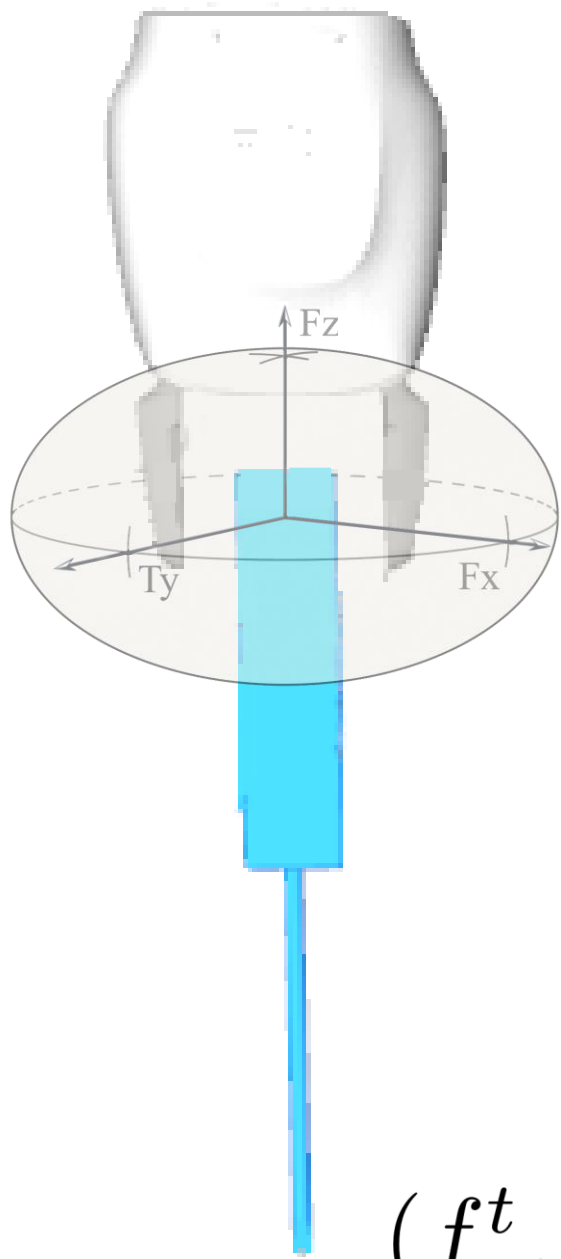
$$w = (f_x, f_z, t_y)$$

$$w^T A w = 1$$

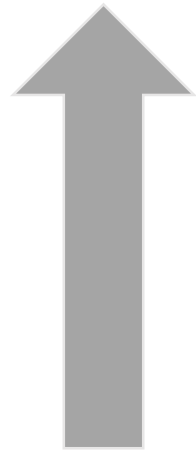
$$A = \begin{bmatrix} \frac{1}{(N\mu)^2} & & 0 \\ & \frac{1}{(N\mu)^2} & \\ 0 & & \frac{1}{(N\mu)^2 (rc)^2} \end{bmatrix}$$



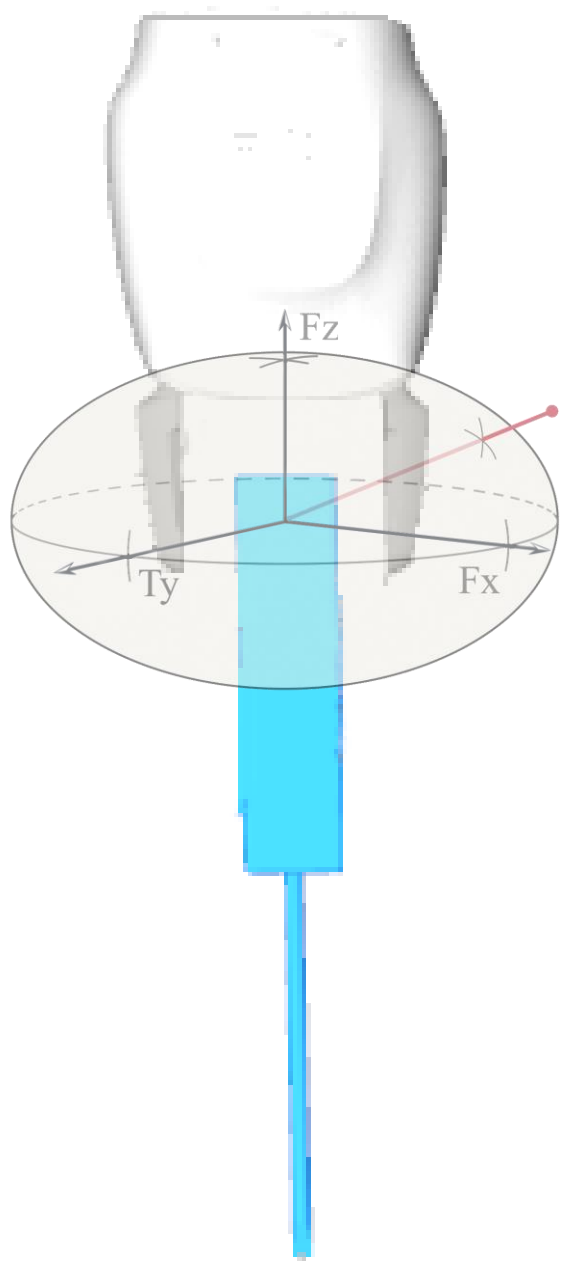
$$(f_x^t, f_y^t, f_z^t, t_x^t, t_y^t, t_z^t)$$



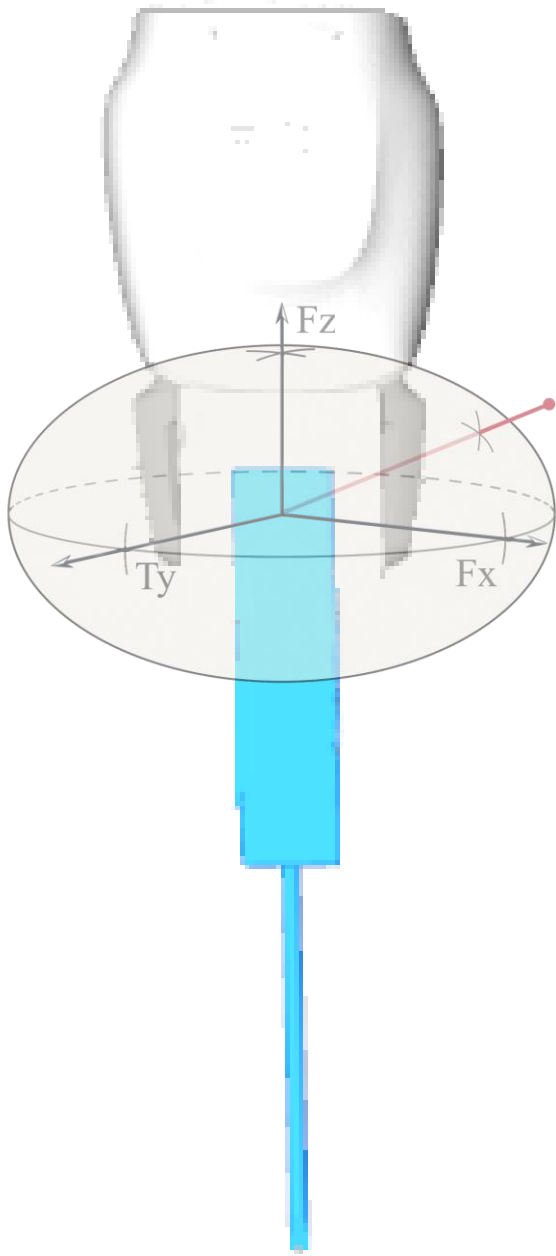
$$(f_x^c, f_y^c, f_z^c, t_x^c, t_y^c, t_z^c)$$



$$(f_x^t, f_y^t, f_z^t, t_x^t, t_y^t, t_z^t)$$

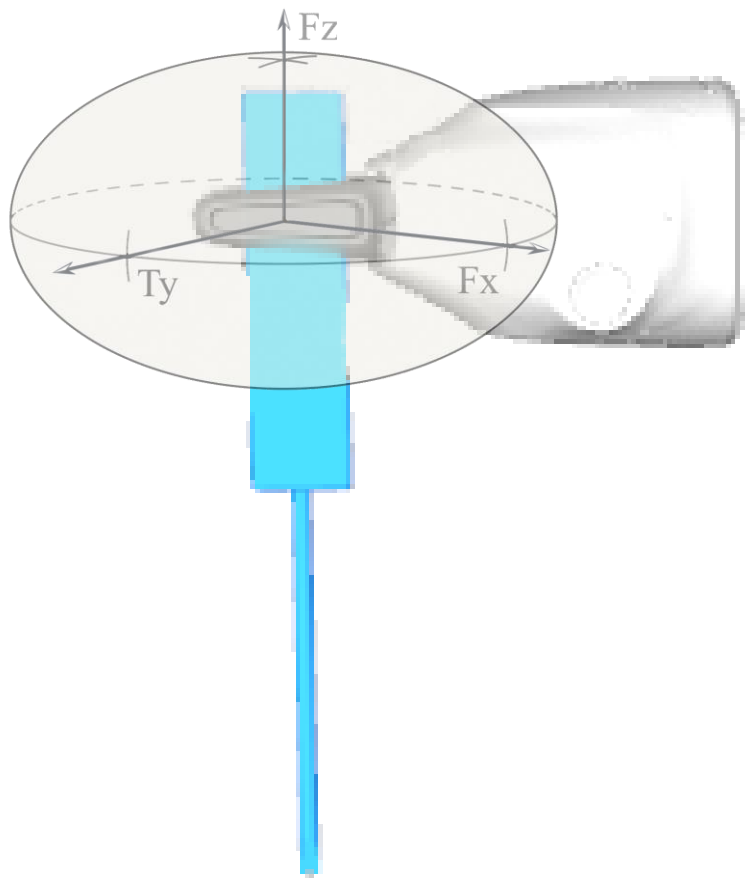


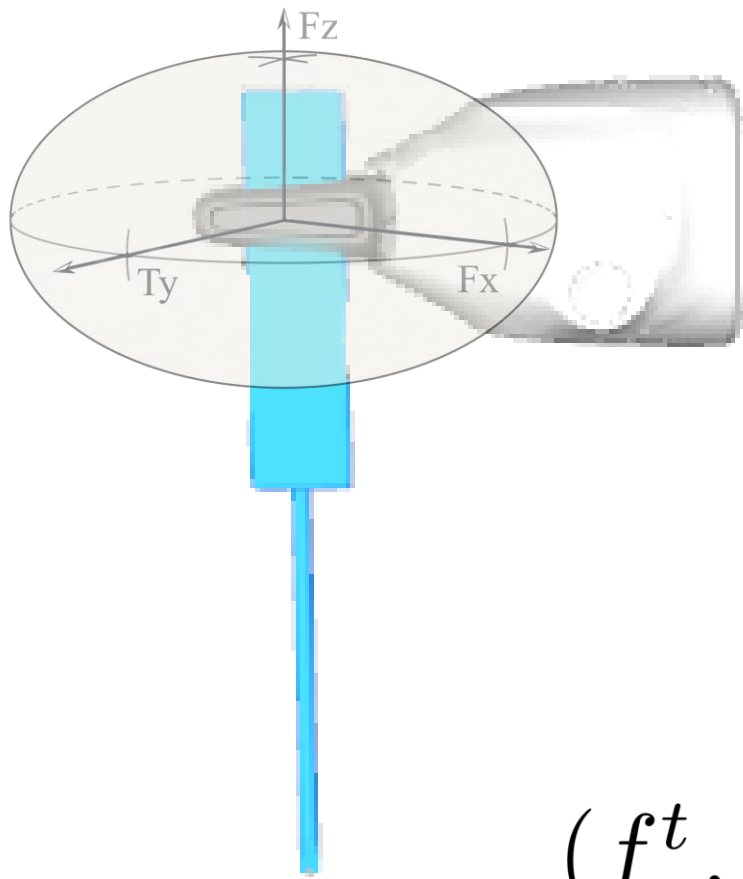
$$(f_x^c, f_z^c, t_y^c)$$



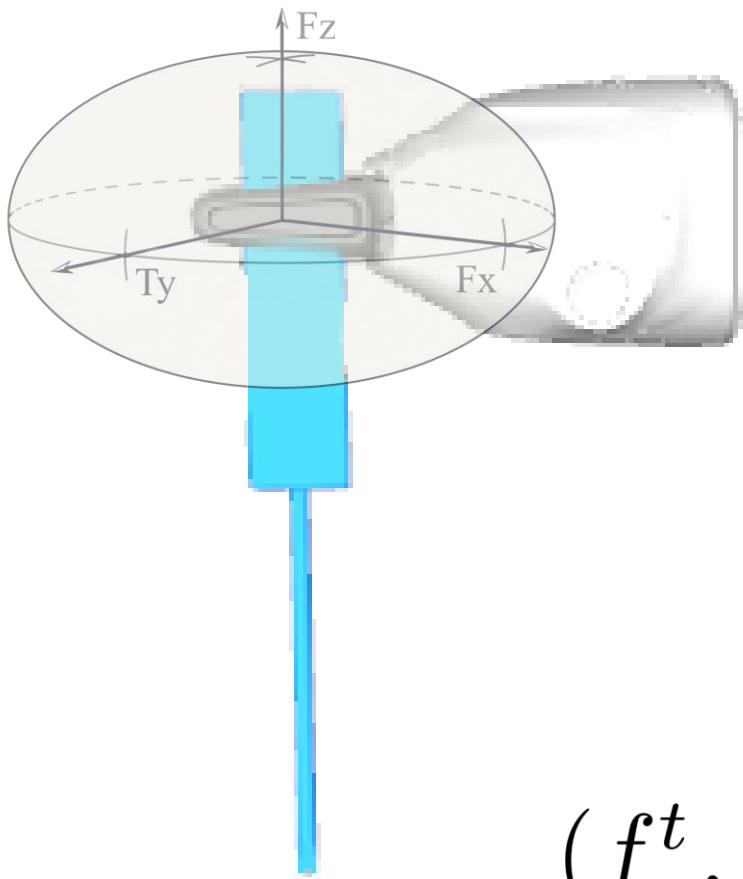
$$\frac{f_x^c}{(N\mu)^2} + \frac{f_z^c}{(N\mu)^2} + \frac{t_y^c}{(N\mu)^2(rc)^2} > 1$$

Bad Grasp!

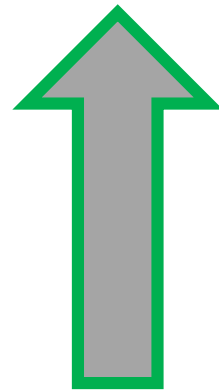




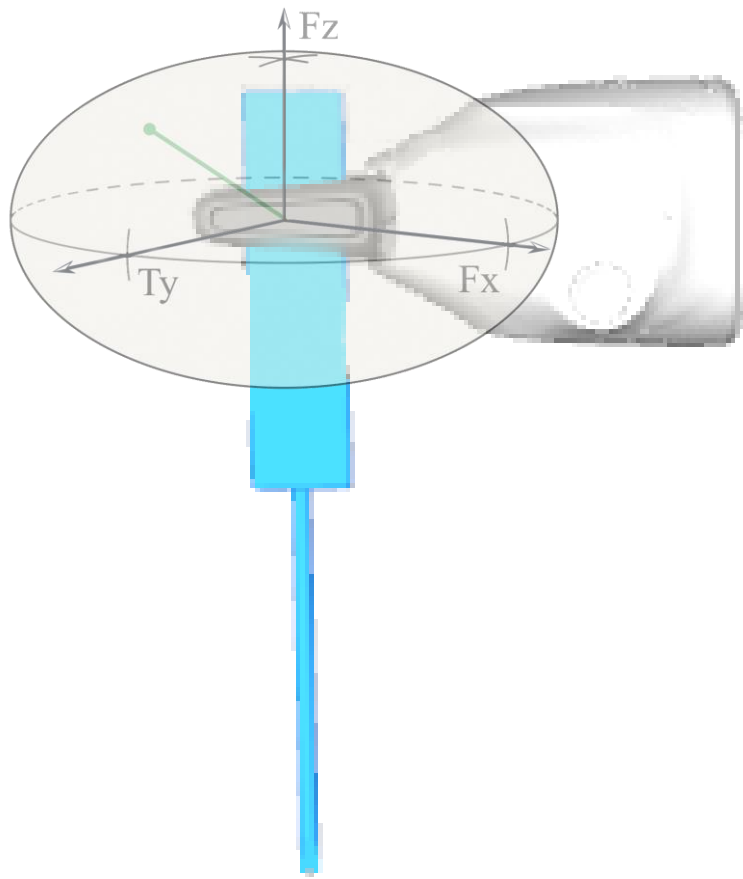
$$(f_x^t, f_y^t, f_z^t, t_x^t, t_y^t, t_z^t)$$



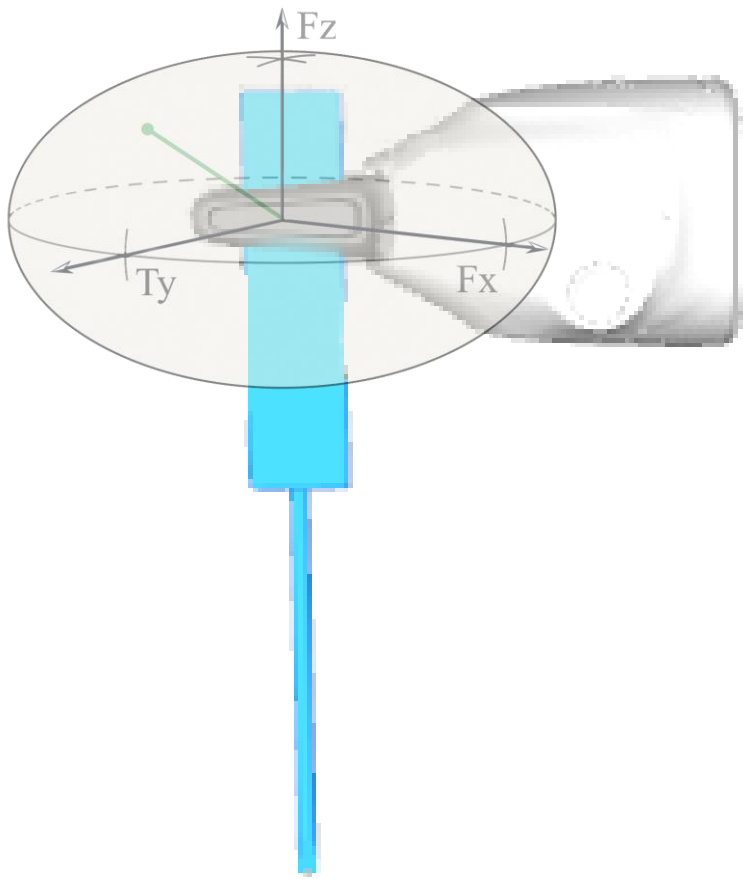
$$(f_x^c, f_y^c, f_z^c, t_x^c, t_y^c, t_z^c)$$



$$(f_x^t, f_y^t, f_z^t, t_x^t, t_y^t, t_z^t)$$

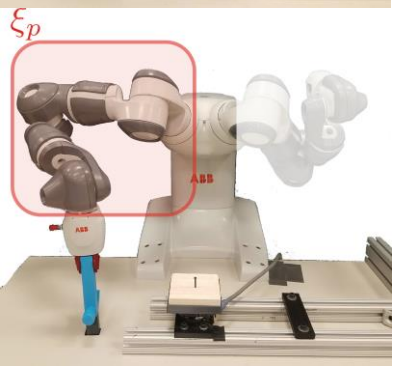
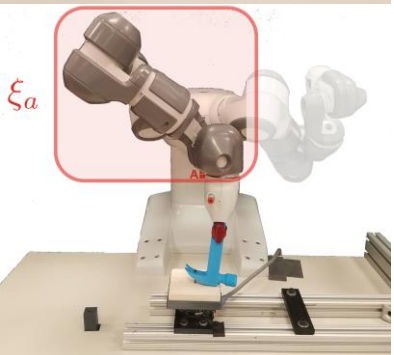
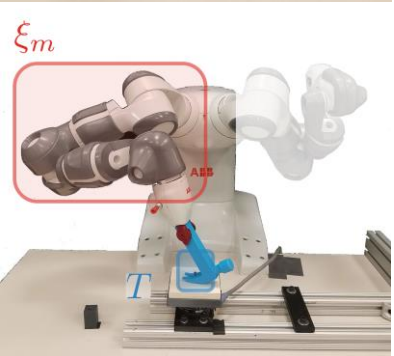
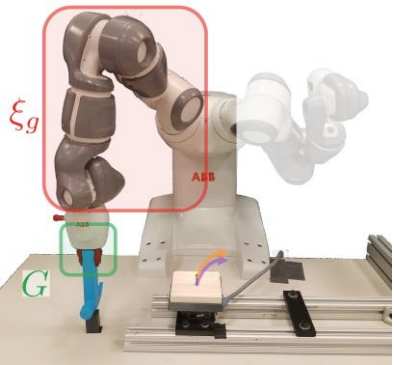


$$(f_x^c, f_z^c, t_y^c)$$

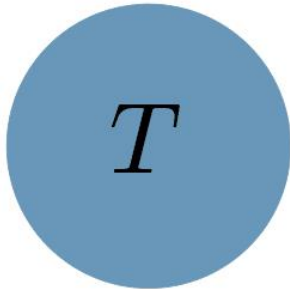


$$\frac{f_x^c}{\sqrt{\mu}^2} + \frac{f_z^c}{(N\mu)^2} + \frac{t_y^c}{(N\mu)^2(rc)^2} < 1$$

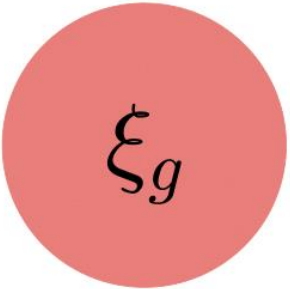
Valid Grasp!



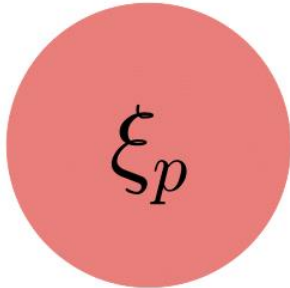
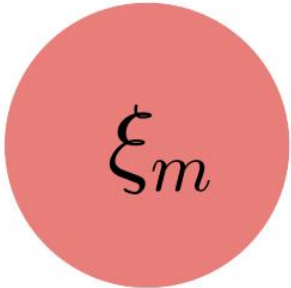
C-Free?
Stable?



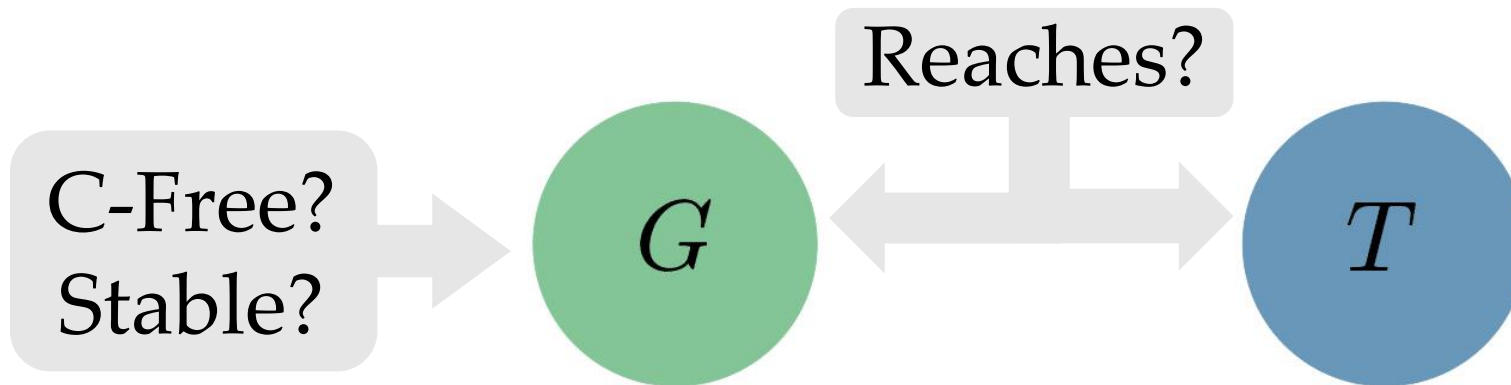
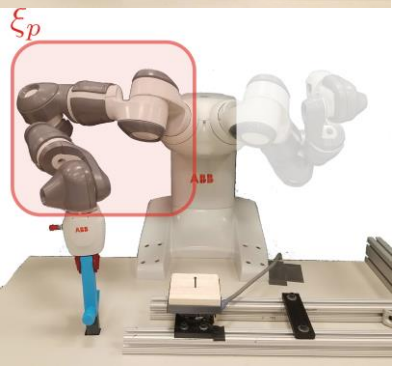
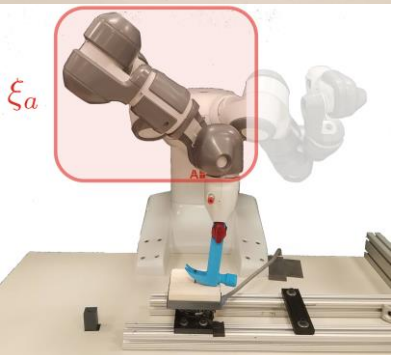
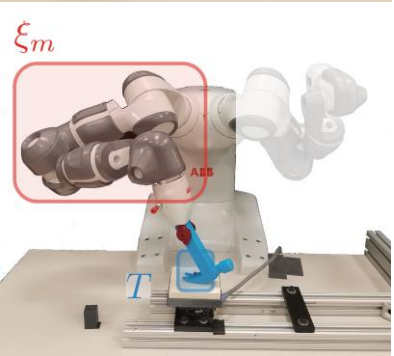
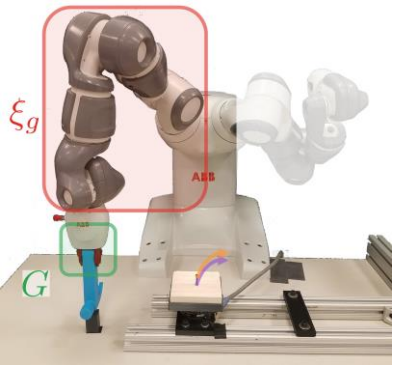
C-Free?

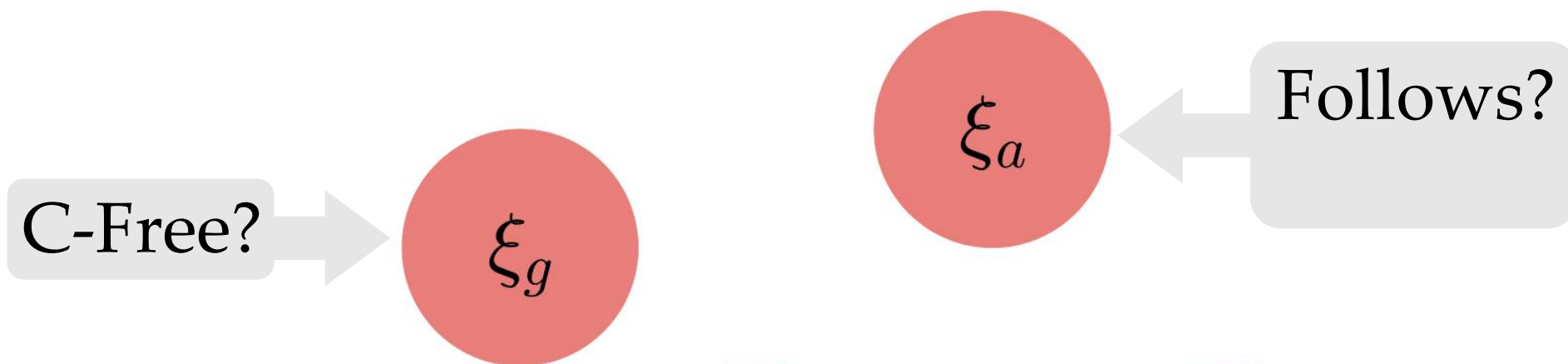
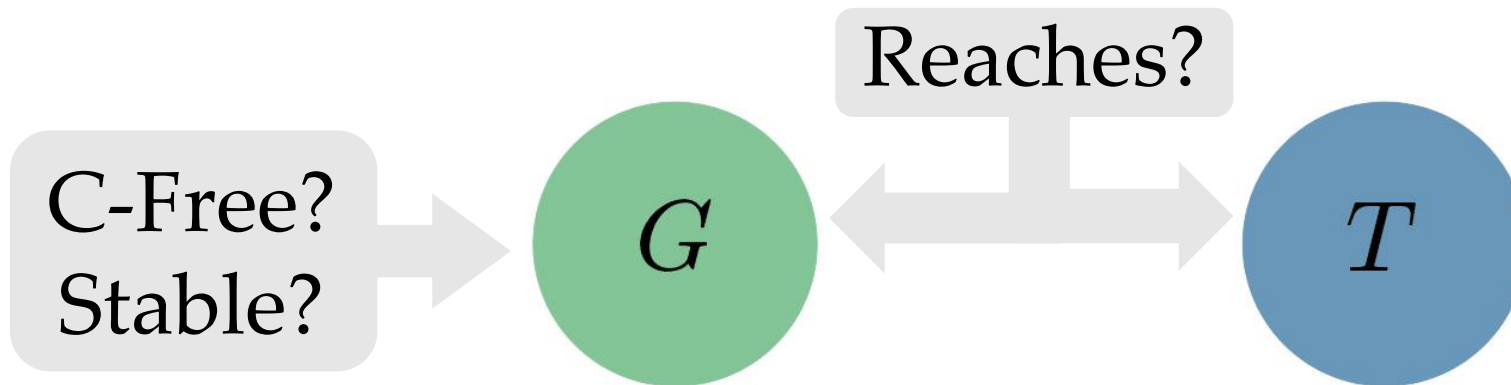
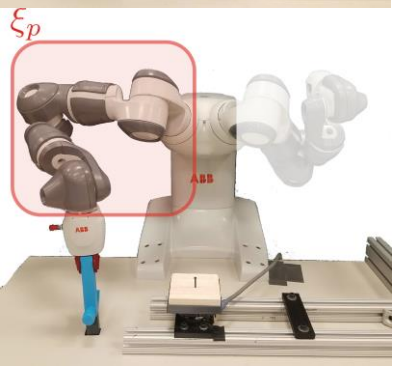
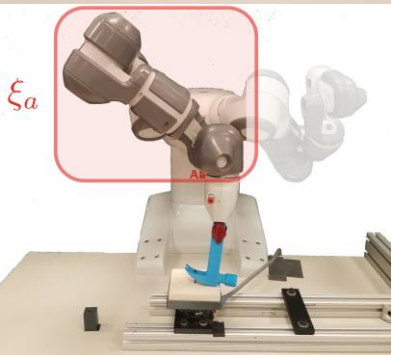
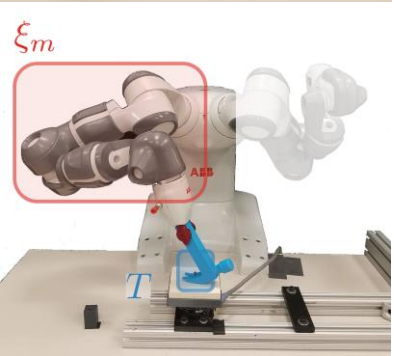
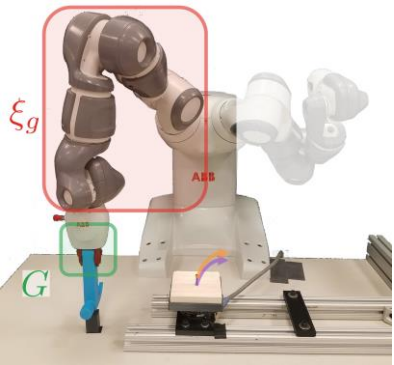


C-Free?

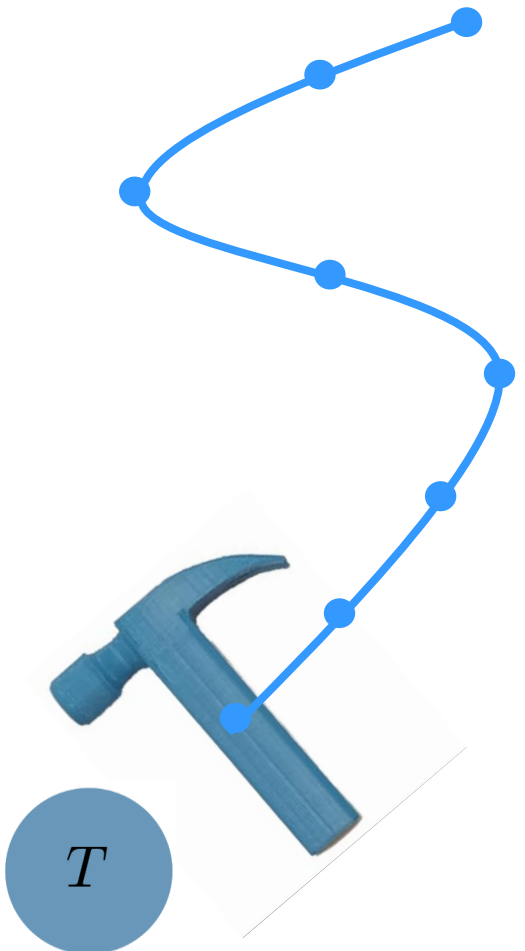


C-Free?



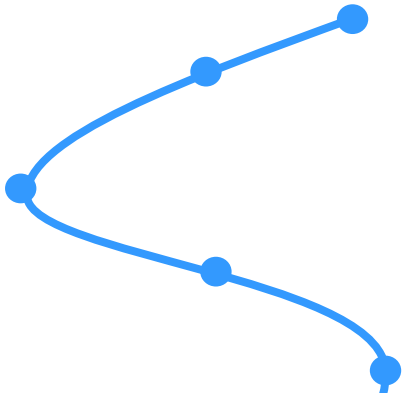






Task Space

$$x \in SE(3)$$

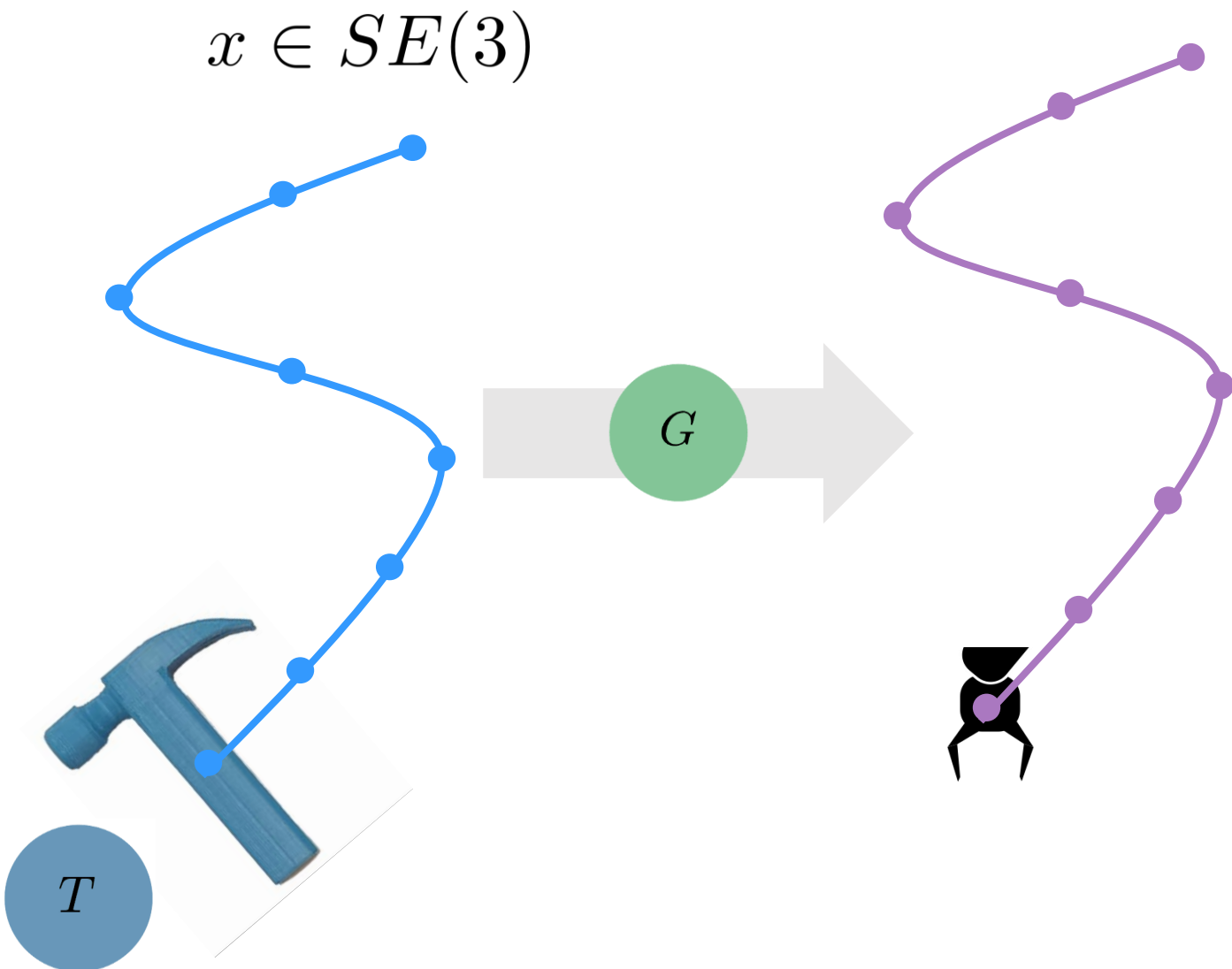


T

Task Space

$x \in SE(3)$

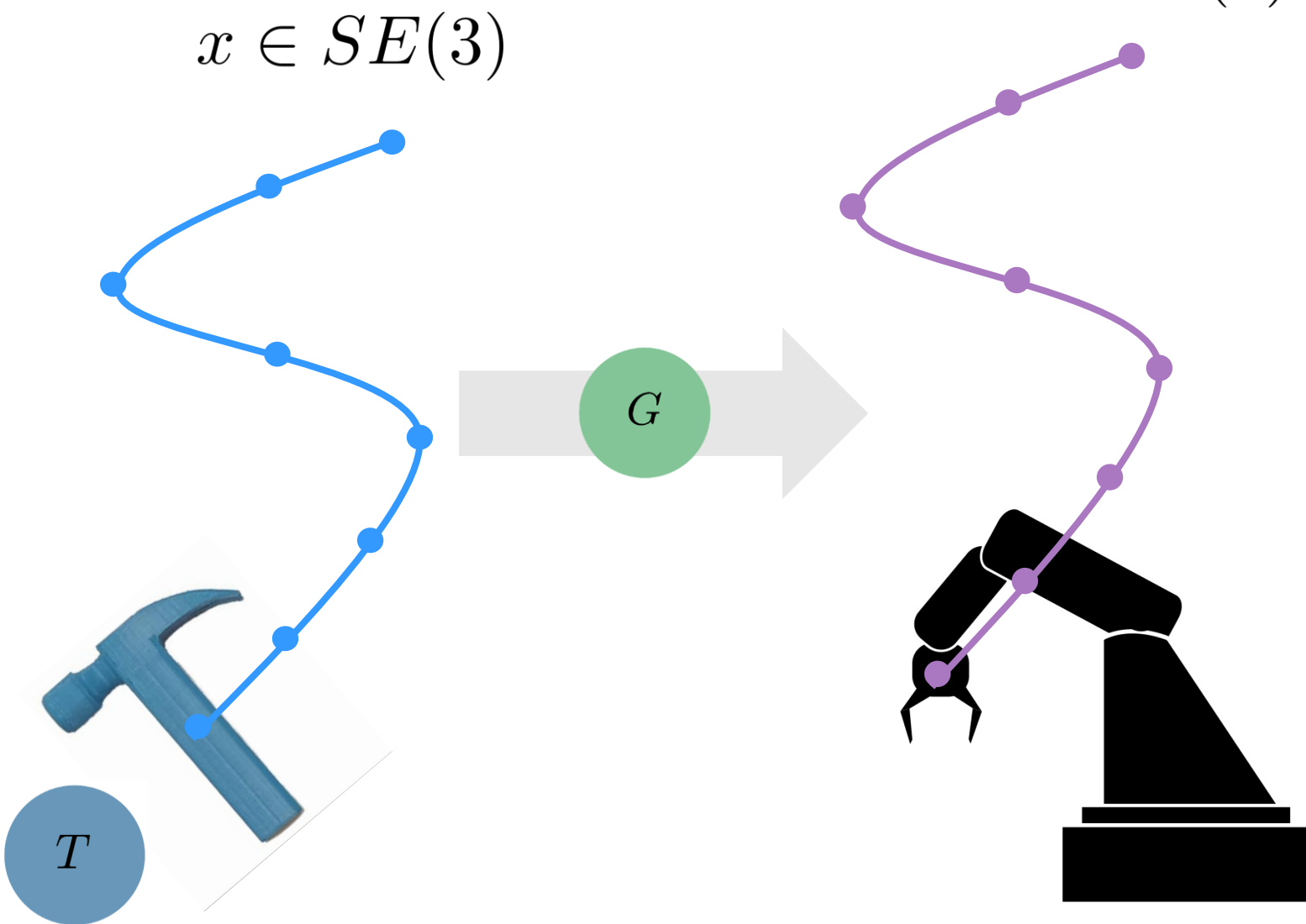
$x \in SE(3)$

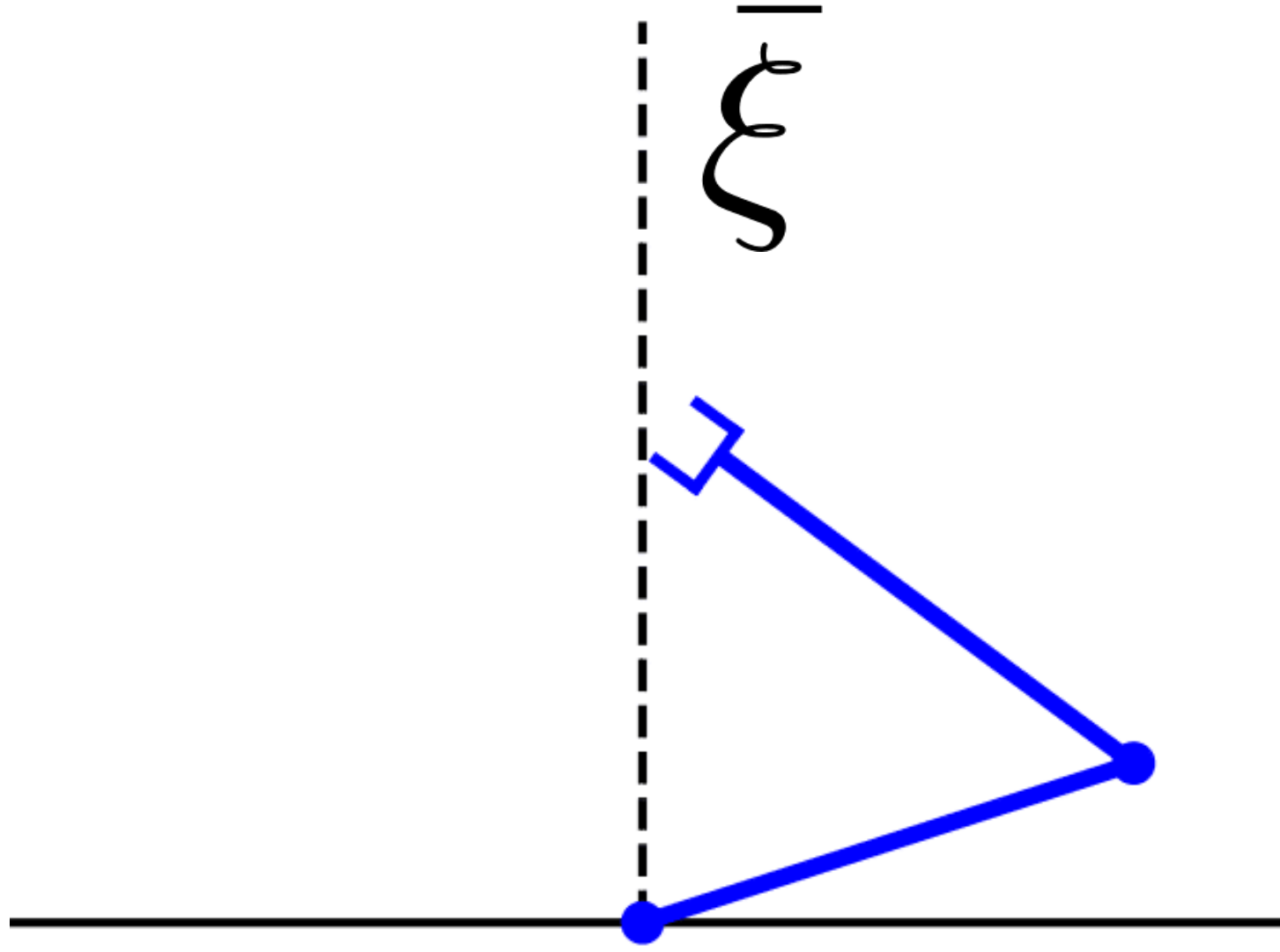


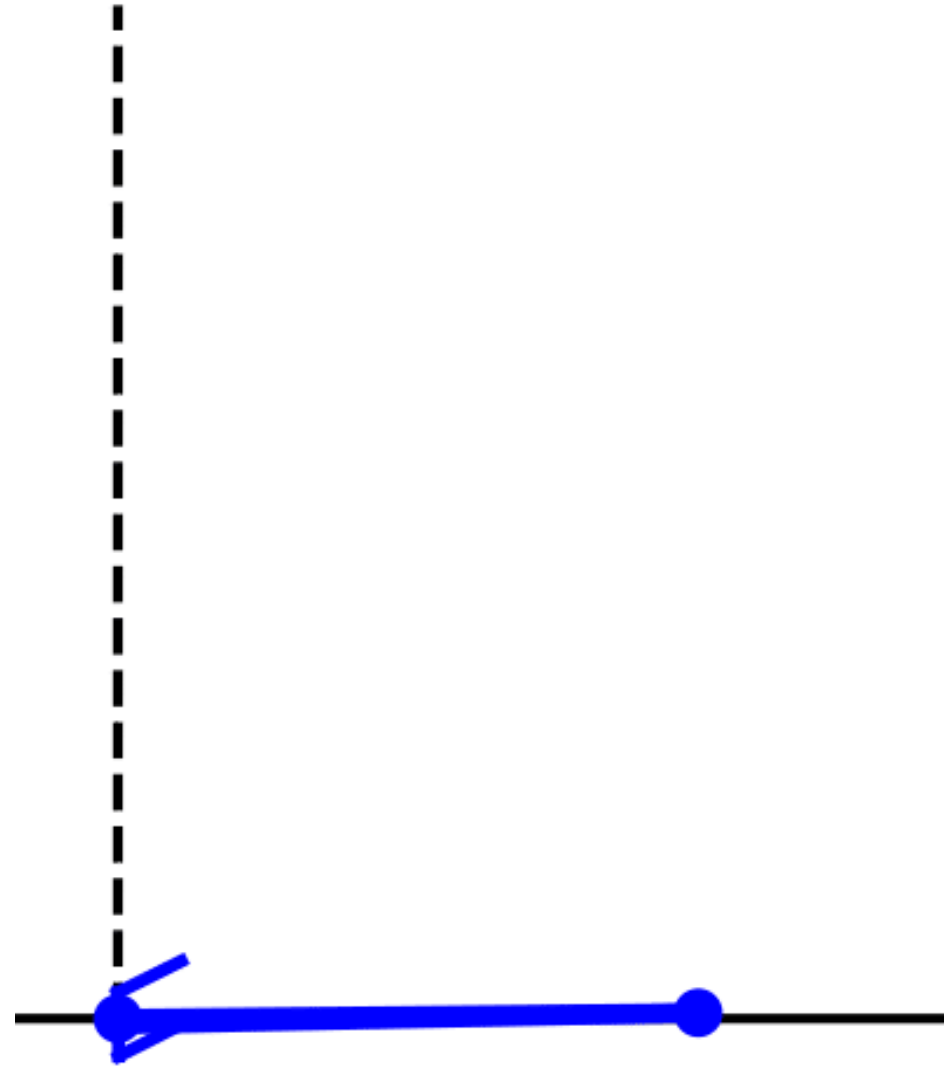
Task Space

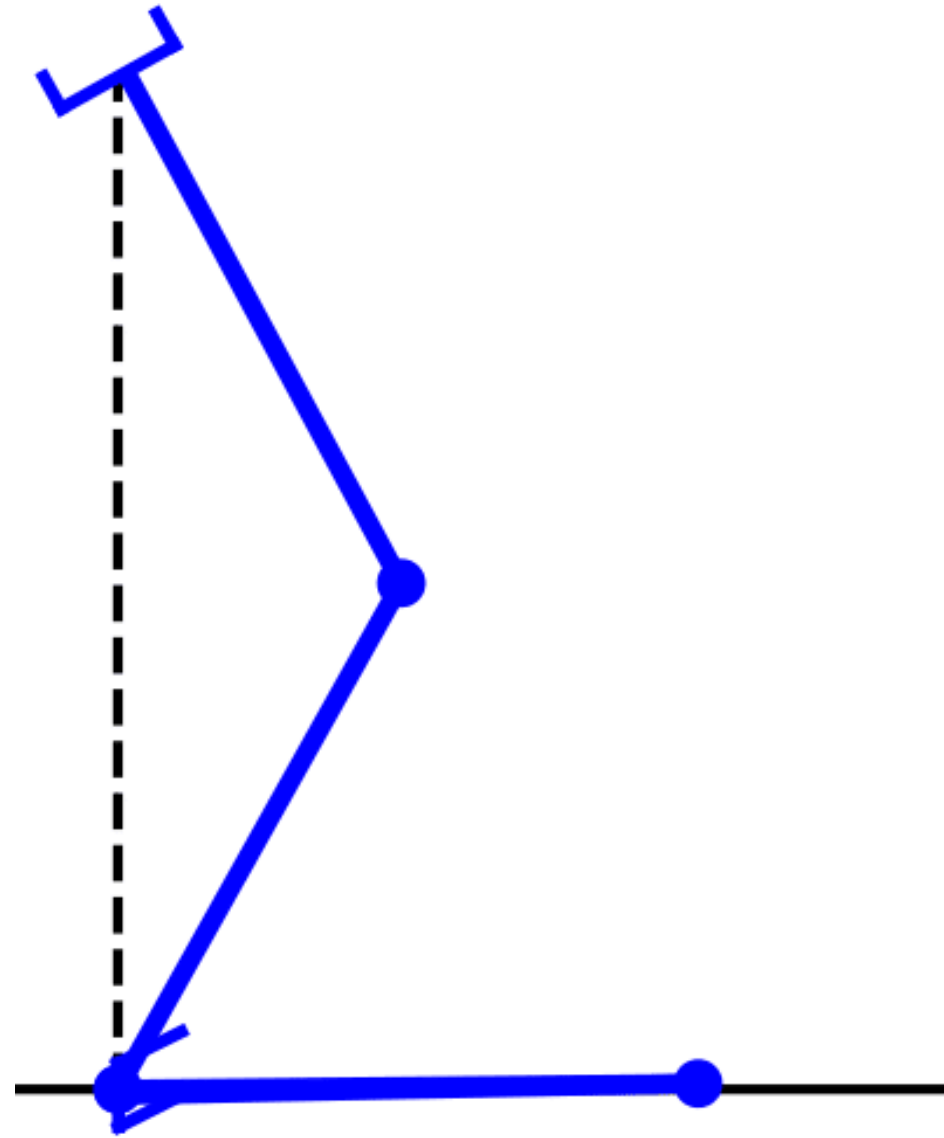
$x \in SE(3)$

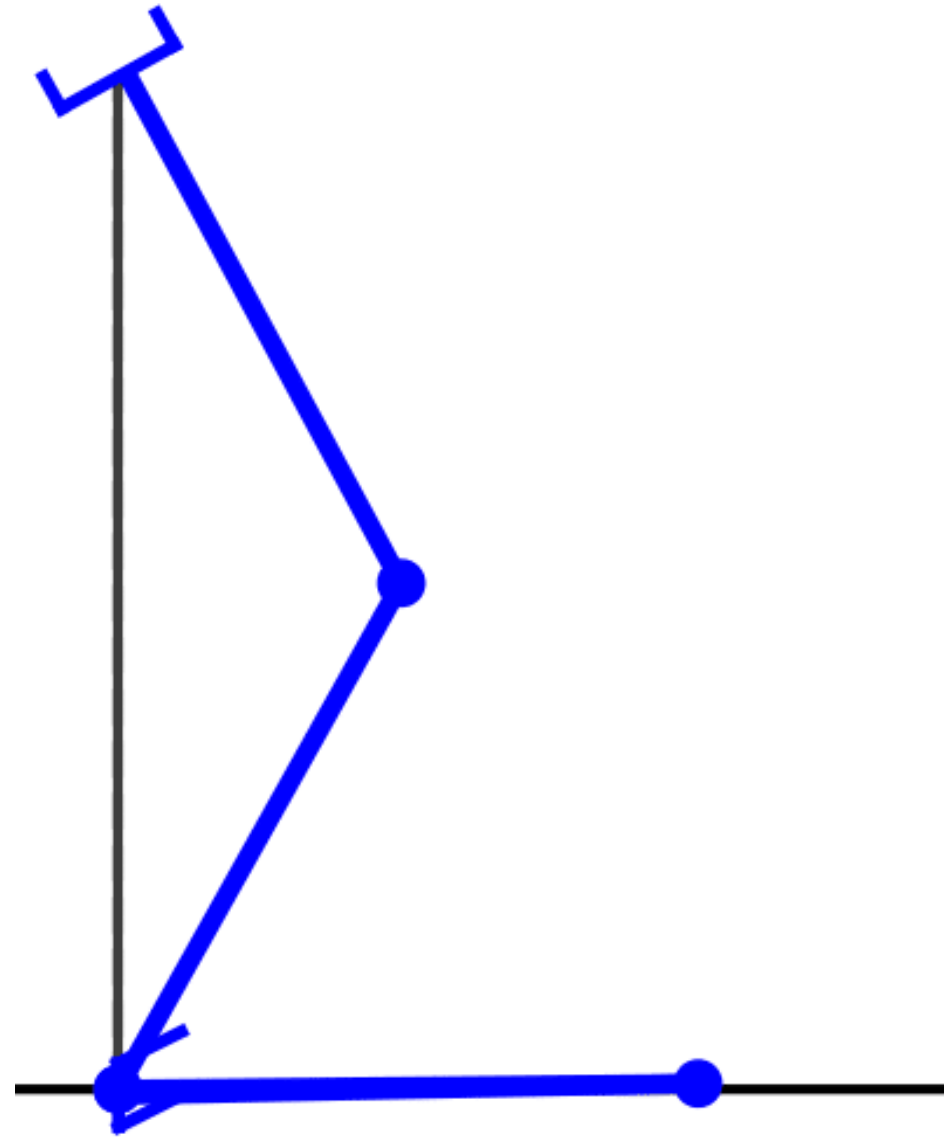
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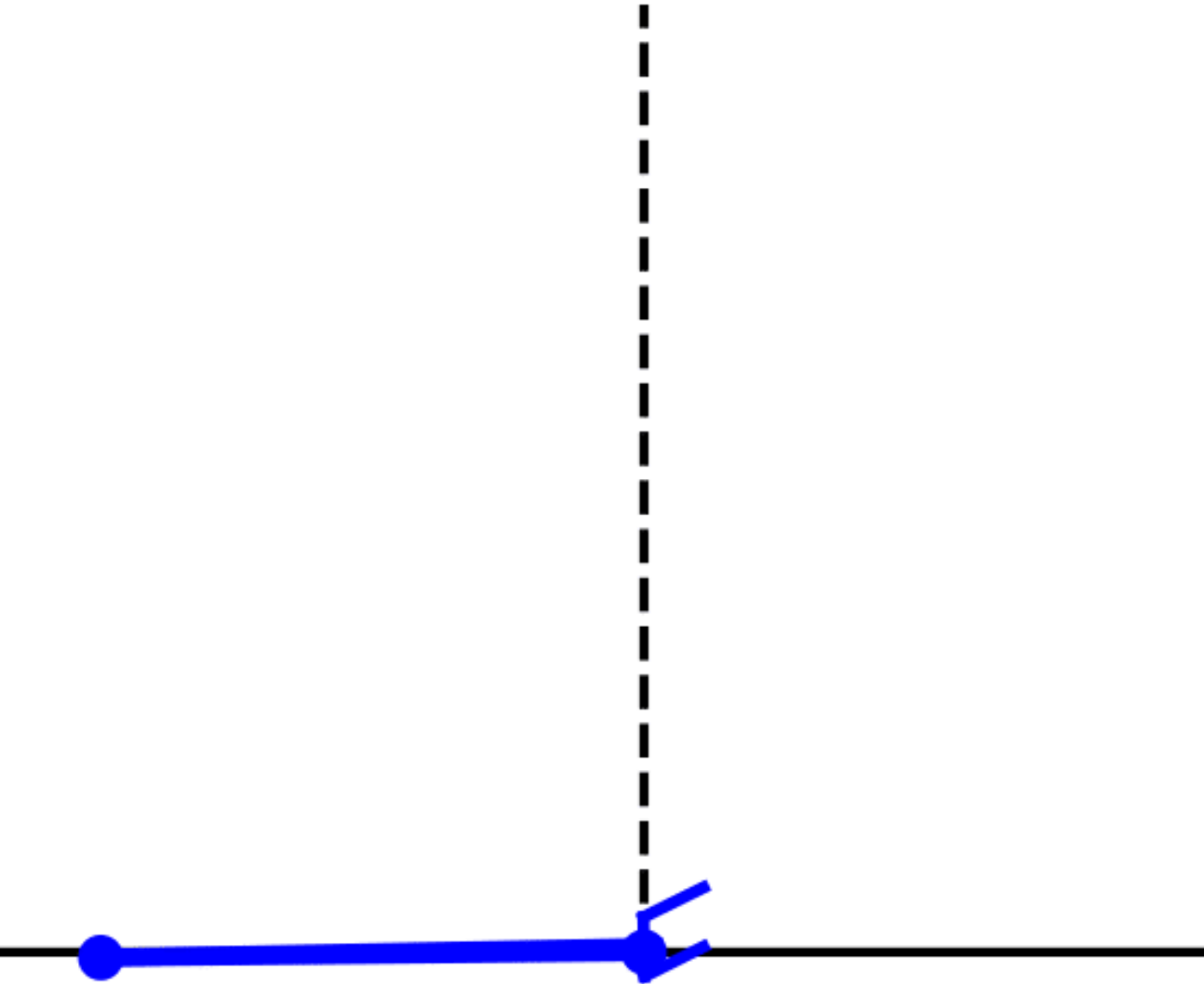


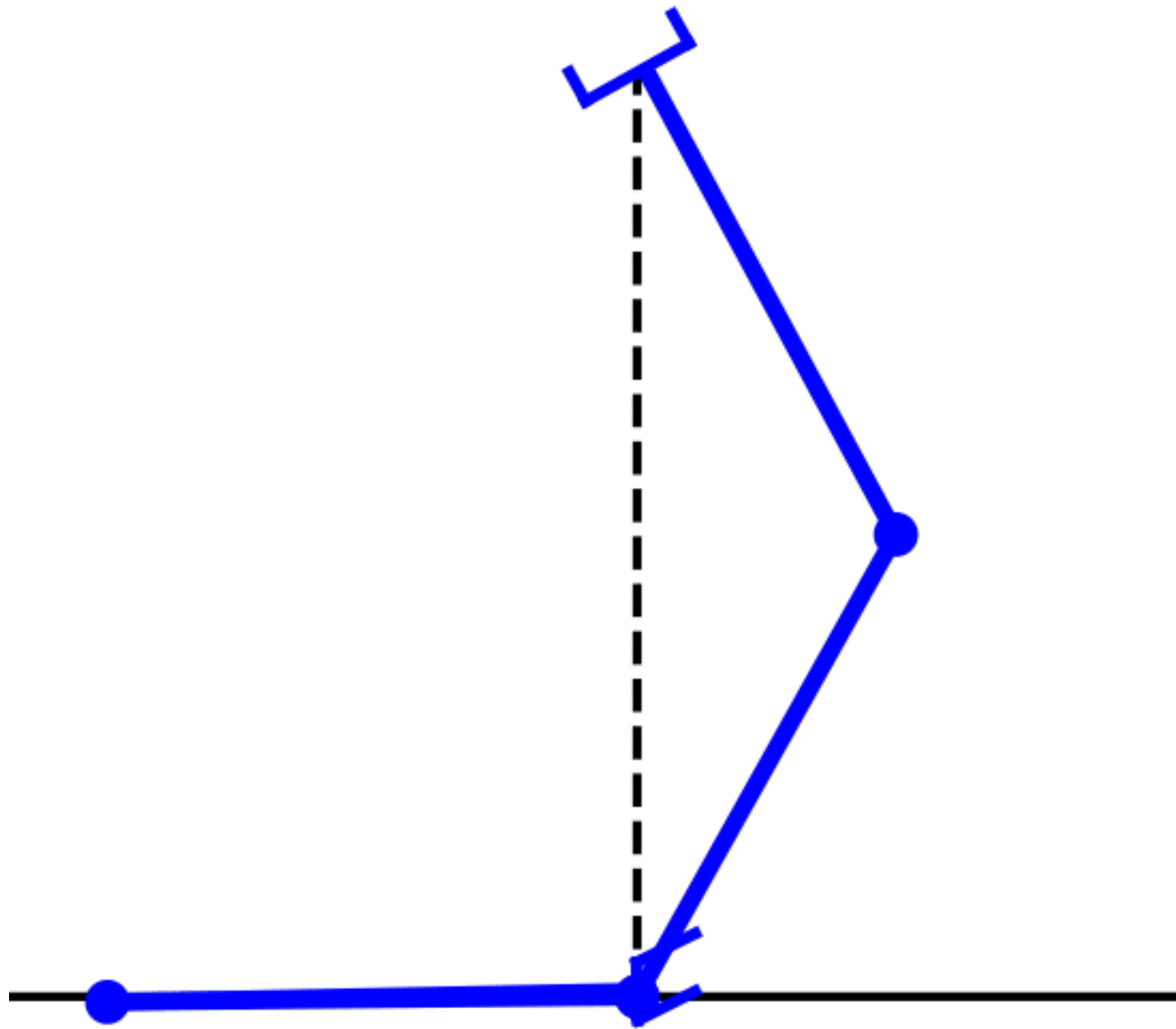


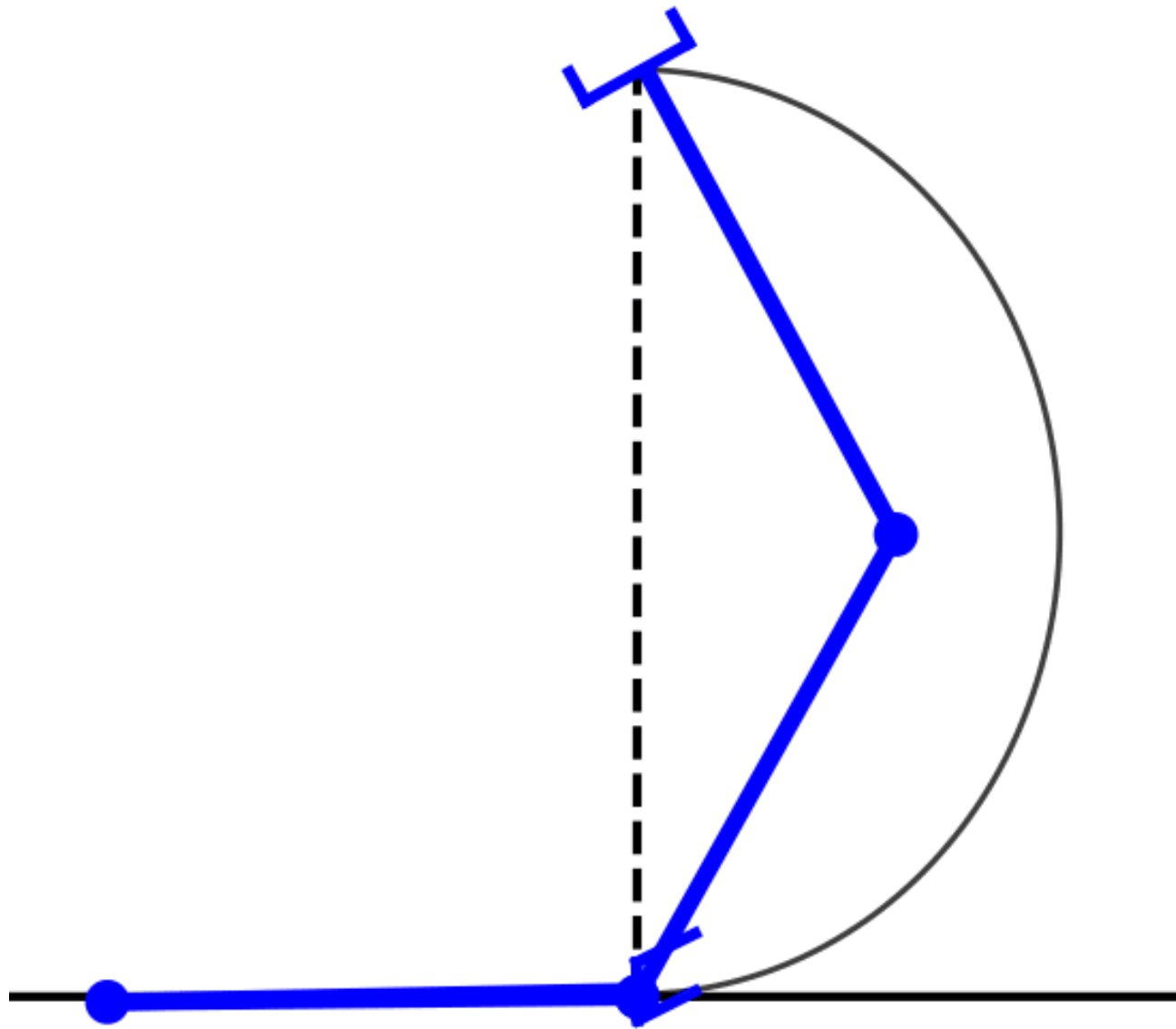








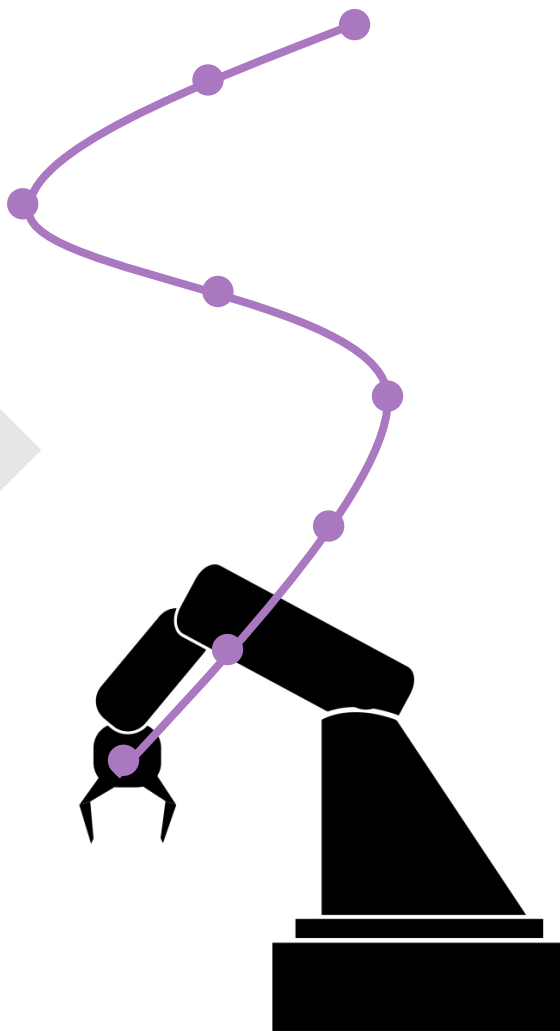
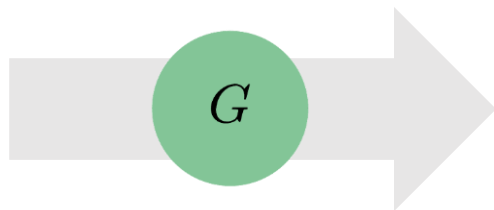




Task Space

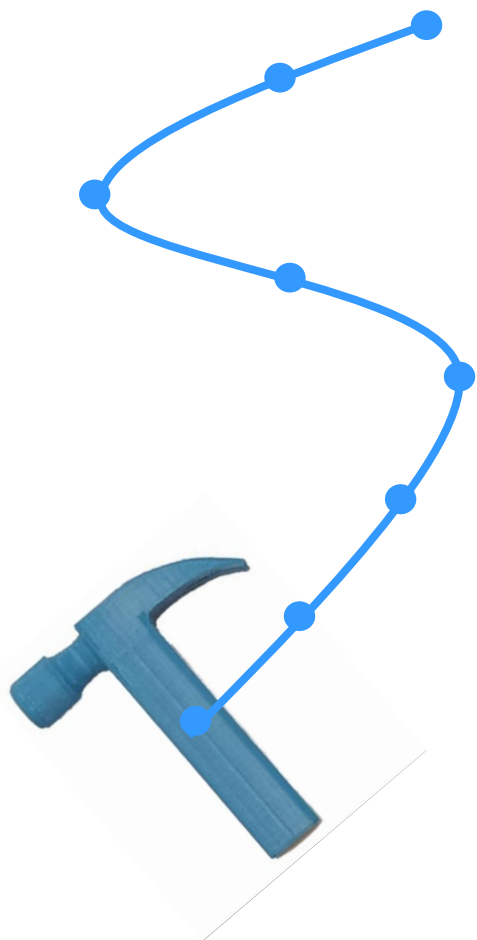
$$x \in SE(3)$$

$$x \in SE(3)$$



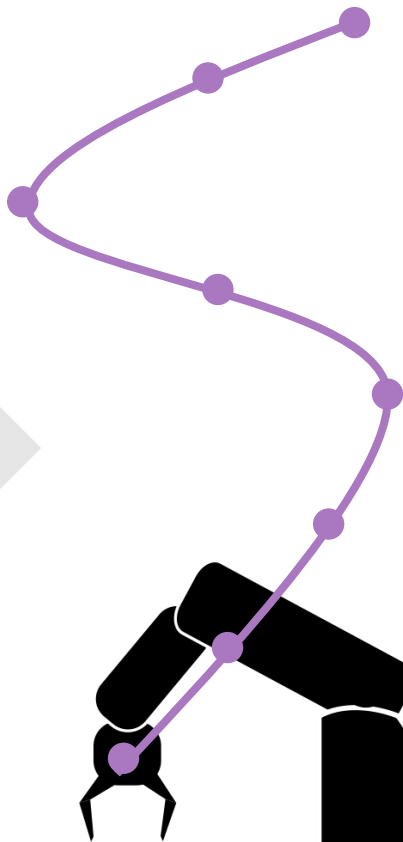
Task Space

$$x \in SE(3)$$



G

$$x \in SE(3)$$



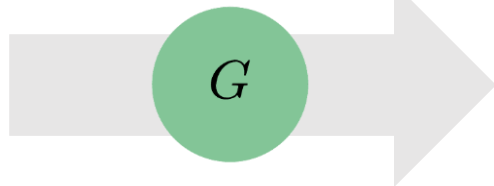
Configuration Space

$$q \in \mathcal{C}$$

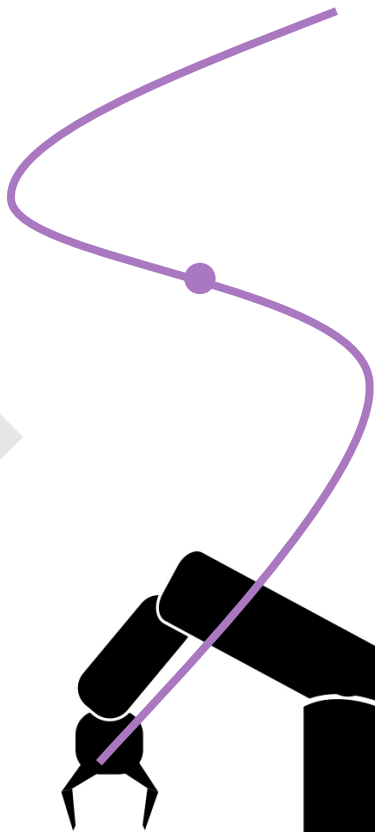


Task Space

$$x \in SE(3)$$

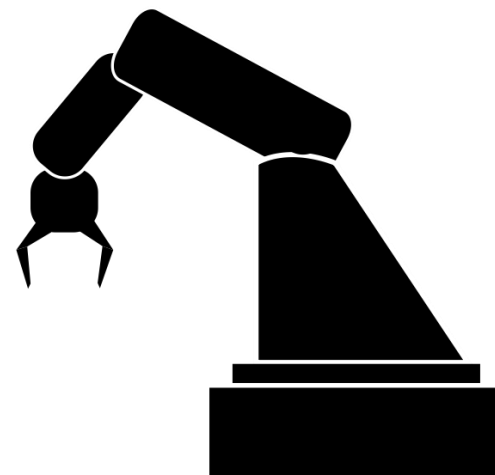


$$x \in SE(3)$$



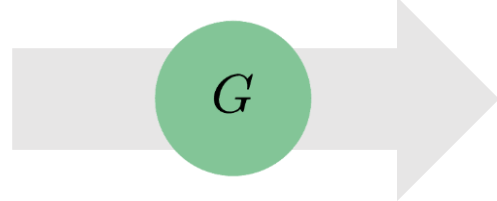
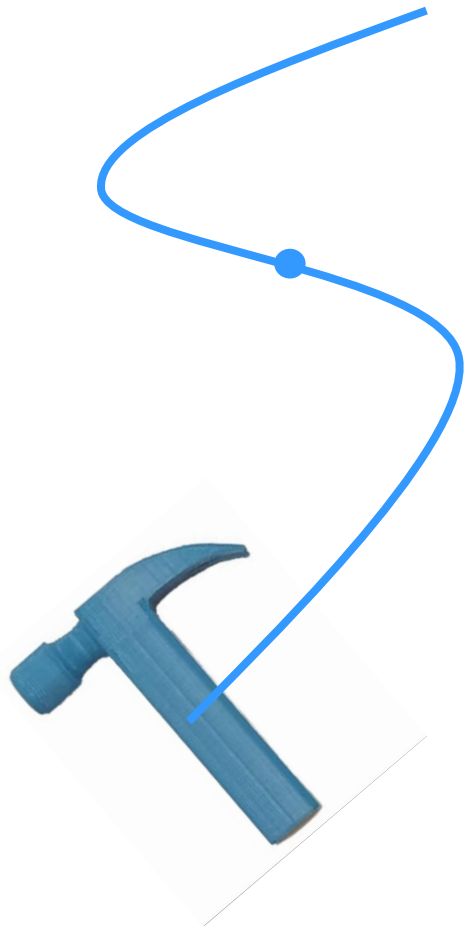
Configuration Space

$$q \in \mathcal{C}$$

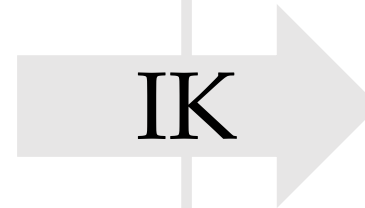
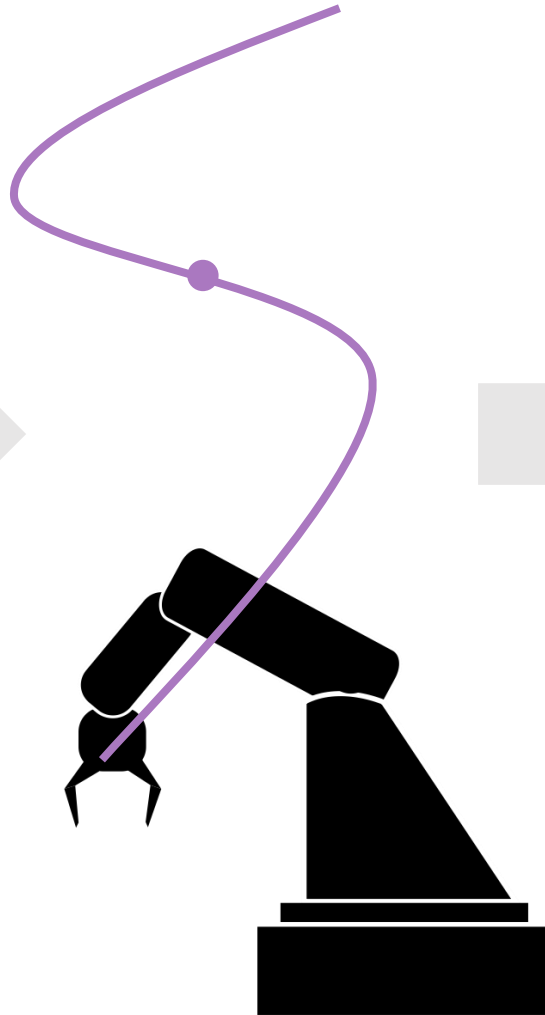


Task Space

$$x \in SE(3)$$

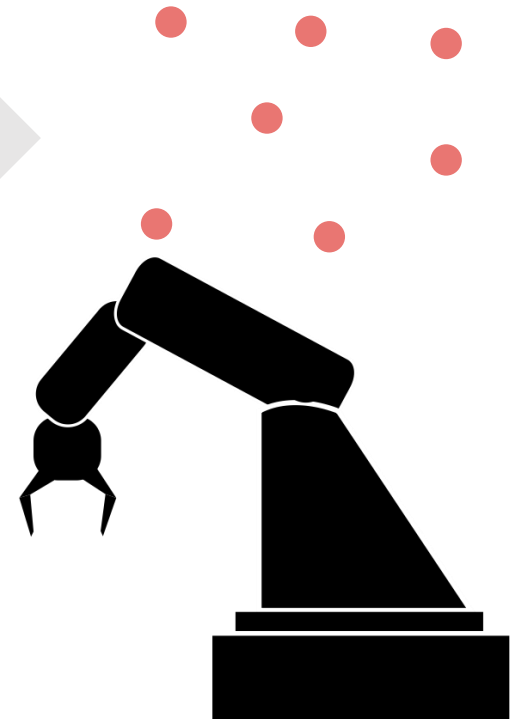


$$x \in SE(3)$$



Configuration Space

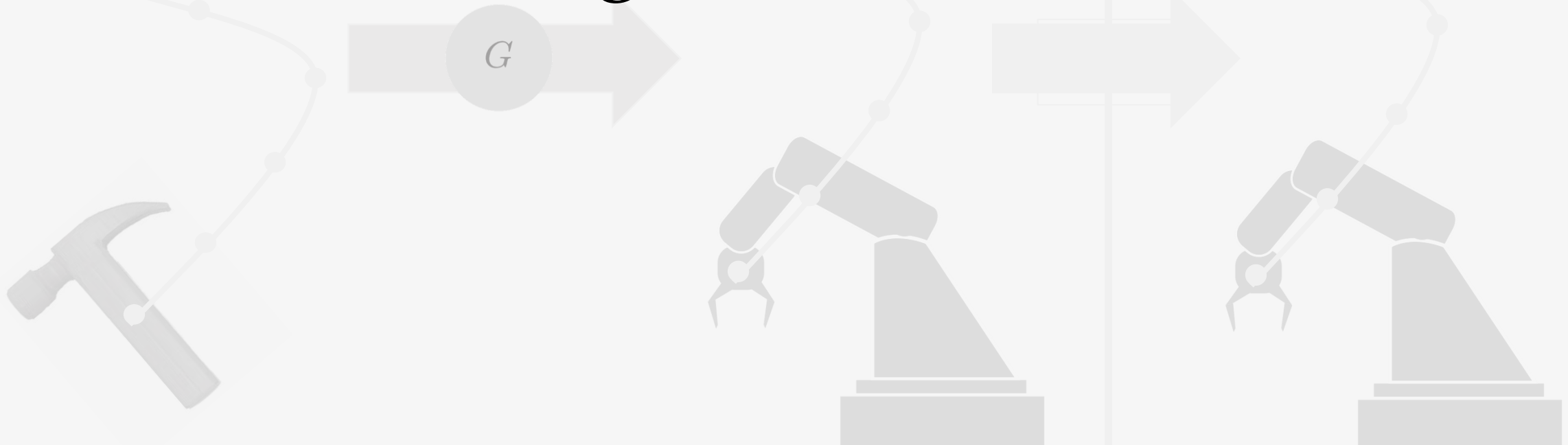
$$q \in \mathcal{C}$$



Task Space

Configuration Space

Organize the space of IK Solution as a **graph** that can be efficiently searched through according to a **distance metric**.



Task Space

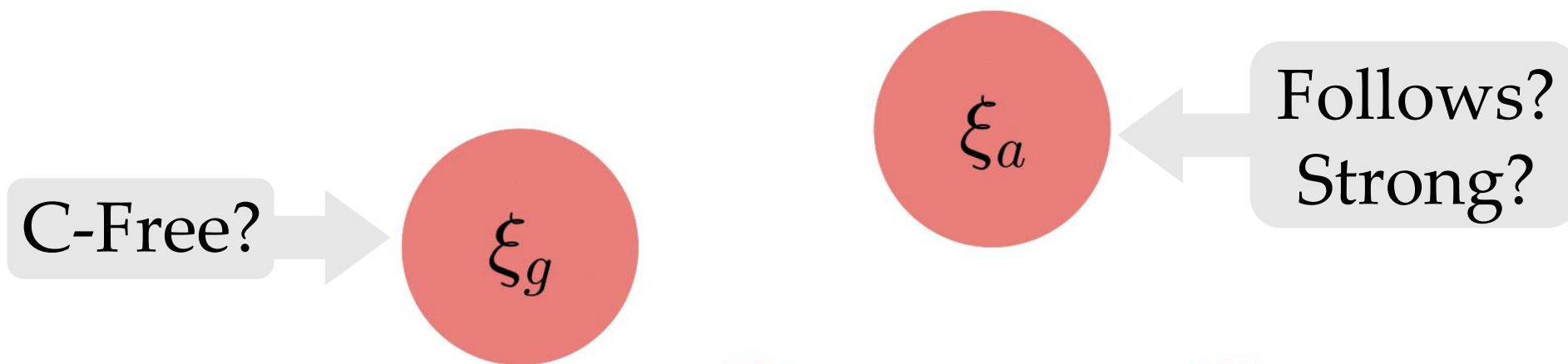
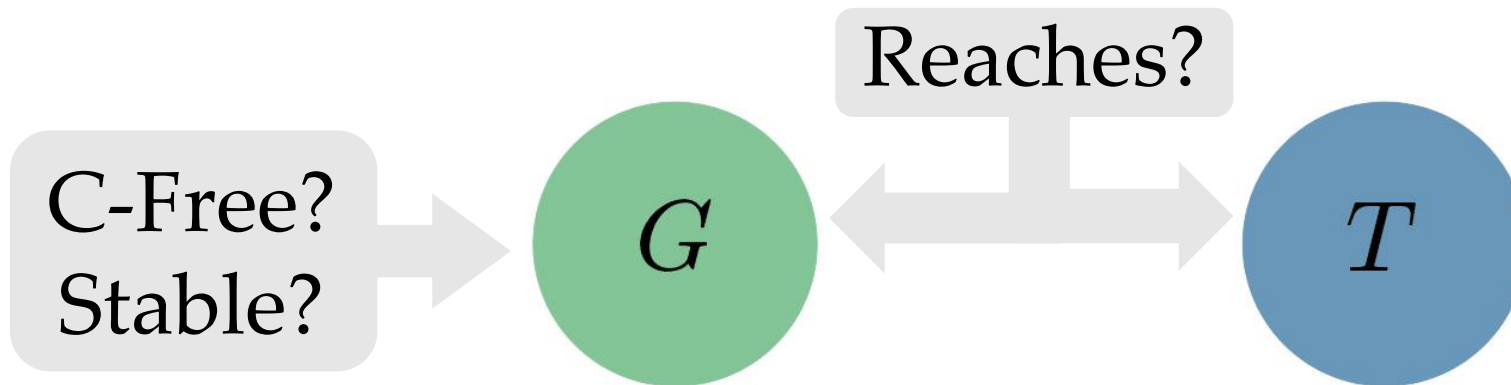
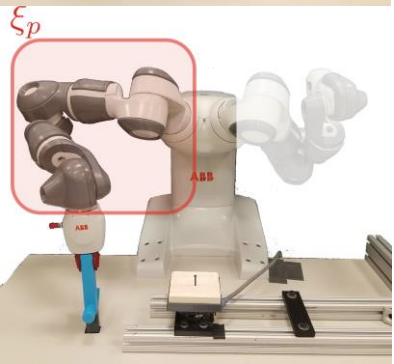
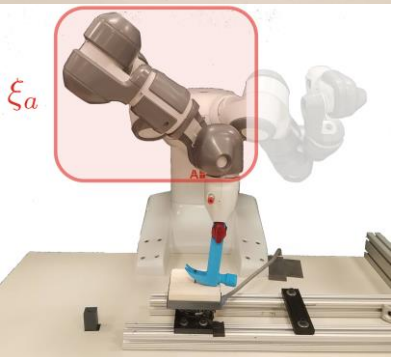
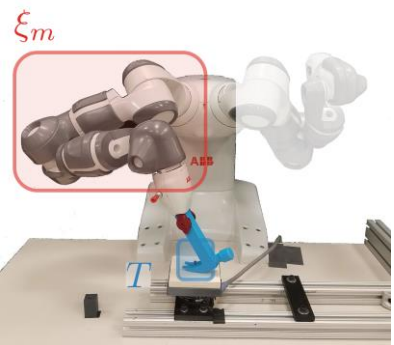
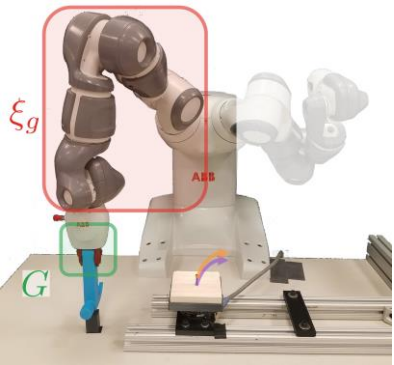
Configuration Space

$$x \in SE(3)$$

Organize the space of IK Solution as a **graph** that can be efficiently searched through according to a **distance metric**.

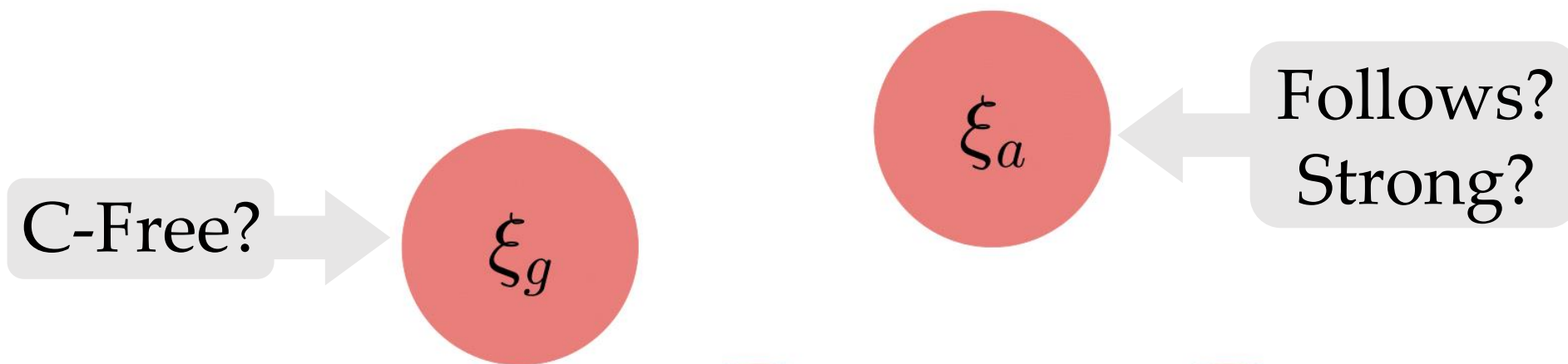
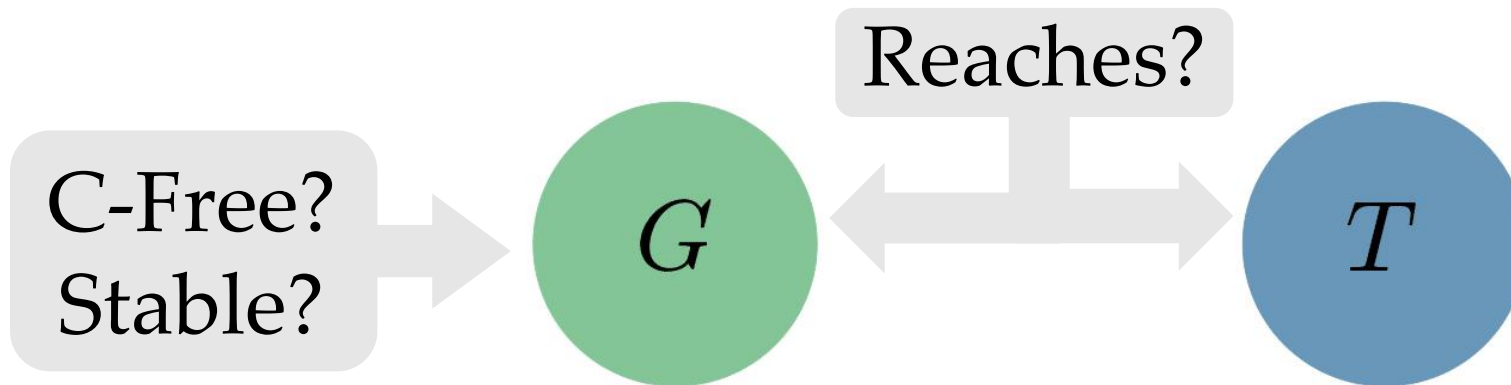
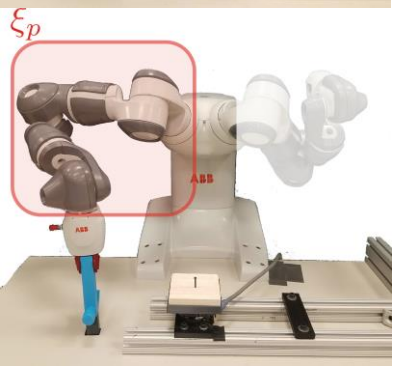
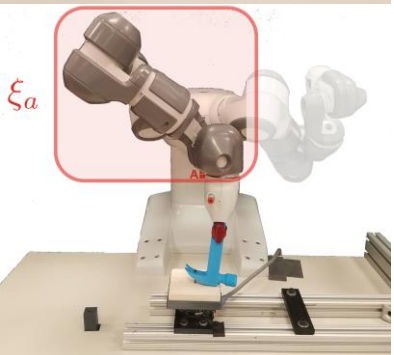
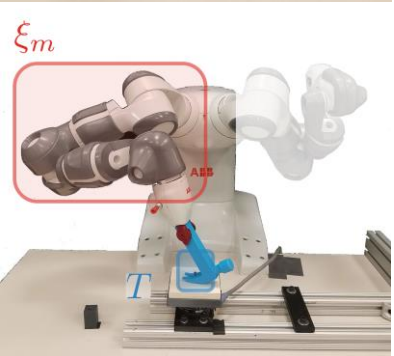
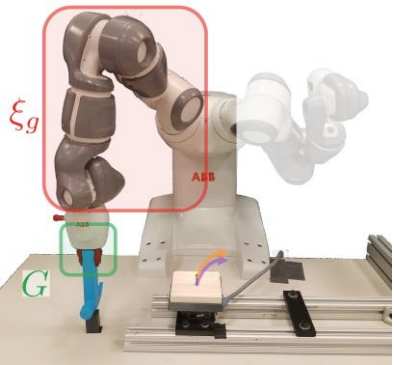
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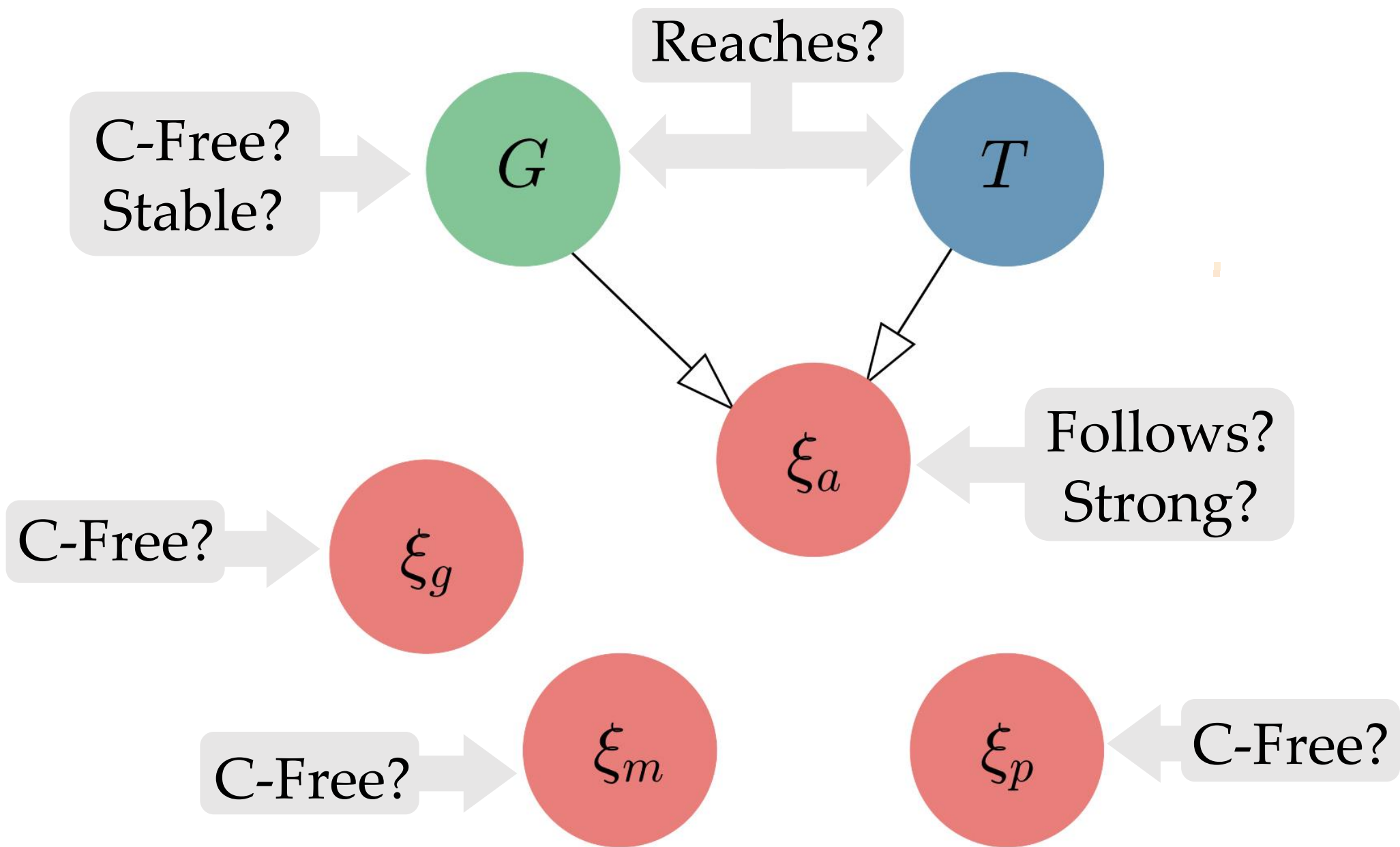
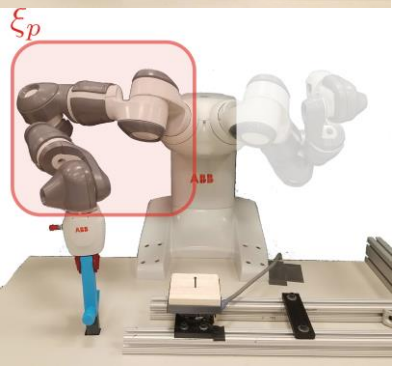
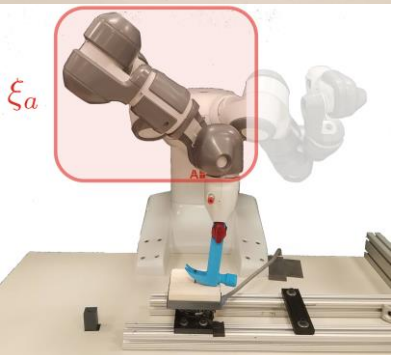
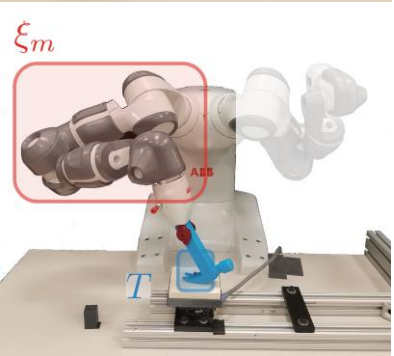
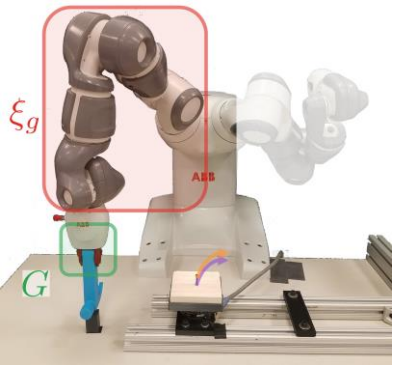
Path with some error

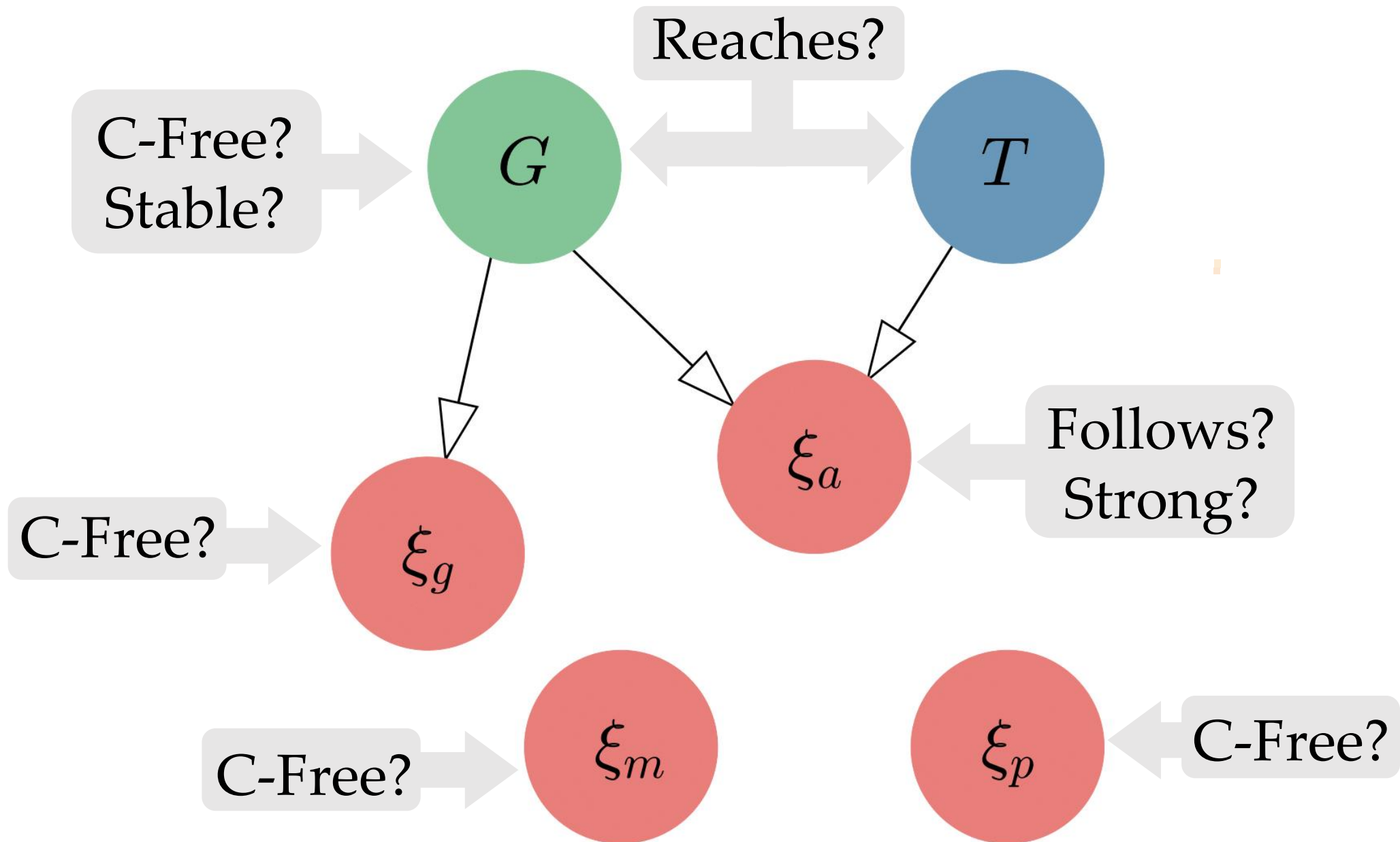
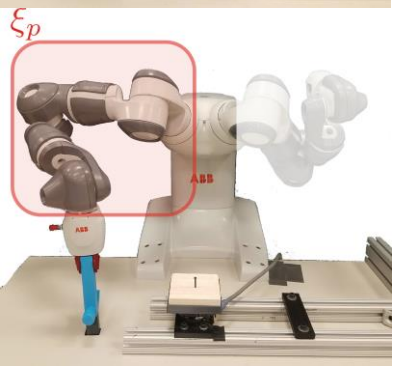
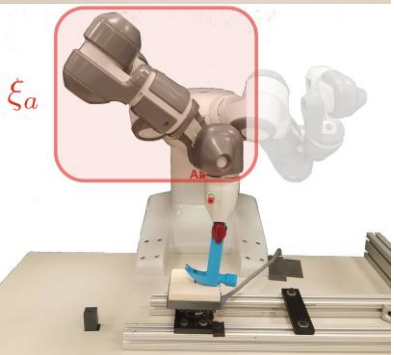
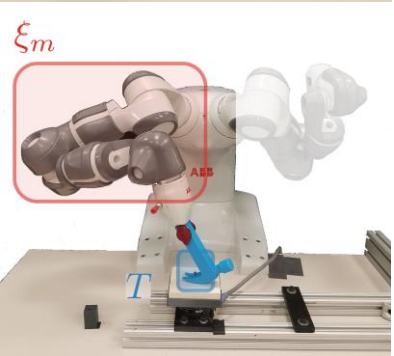
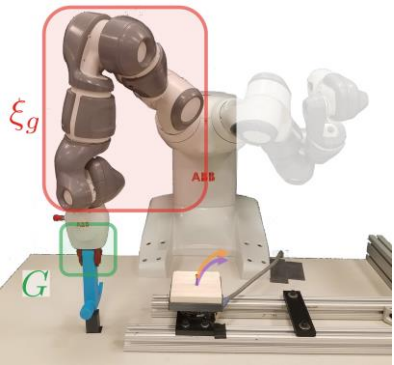


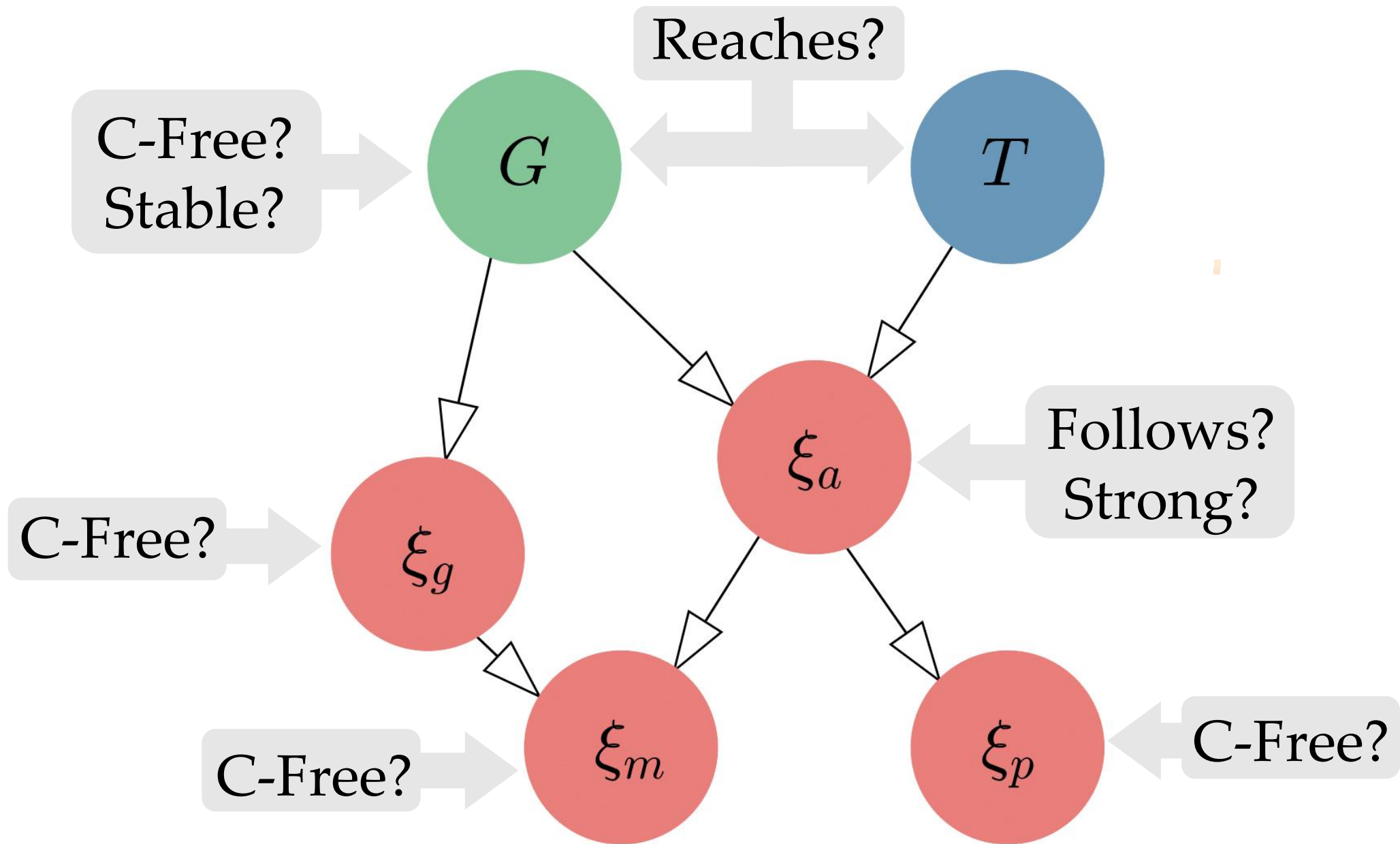
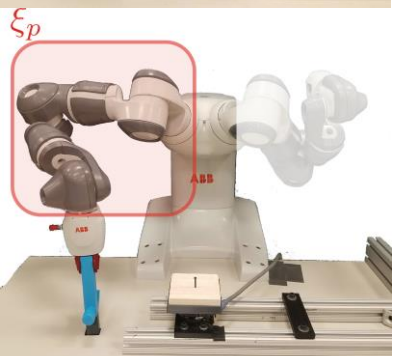
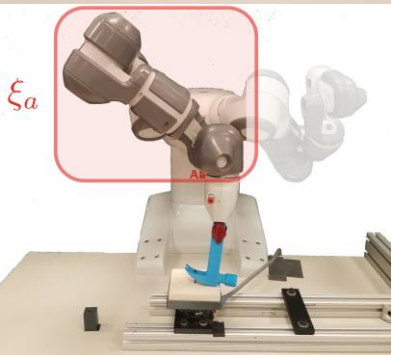
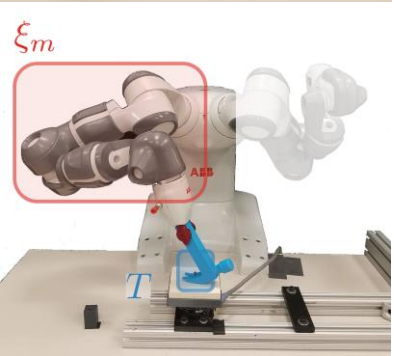
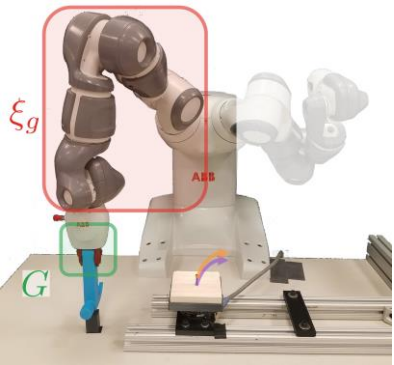
$$\tau_{ext} = J^T(q) f_{ext}$$

$$\tau_{lim} > \tau_{ext} = J^T(q) f_{ext}$$

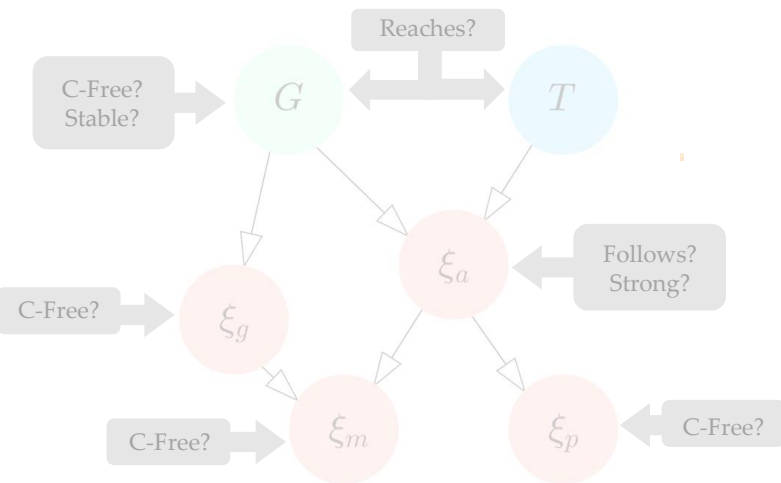




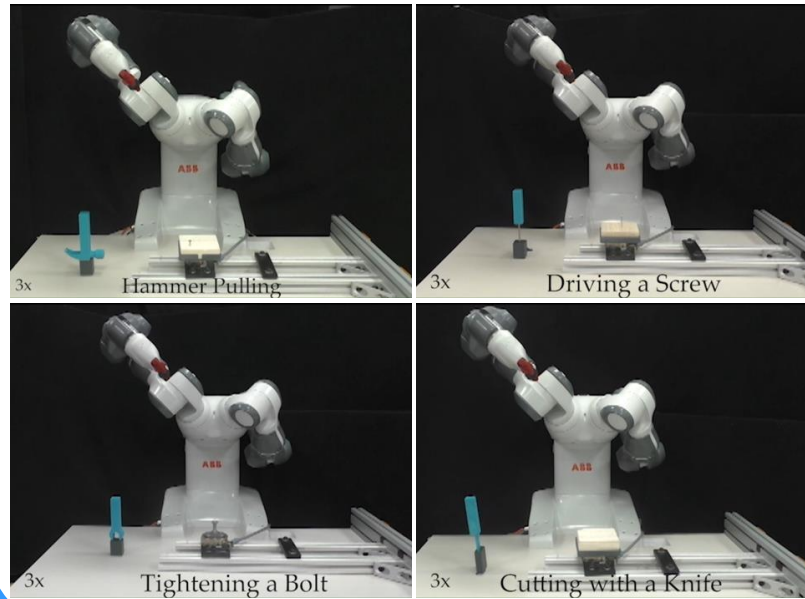




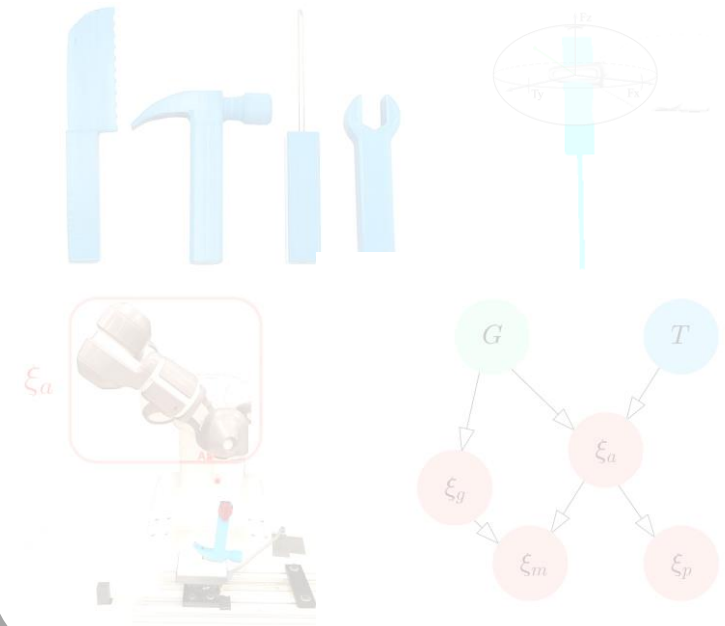
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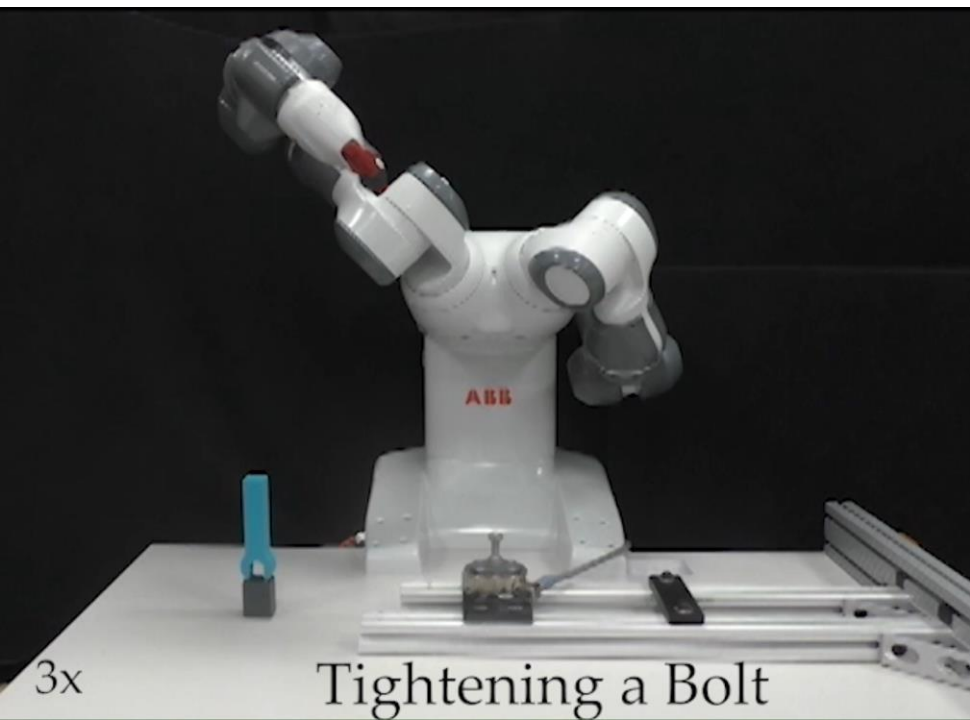
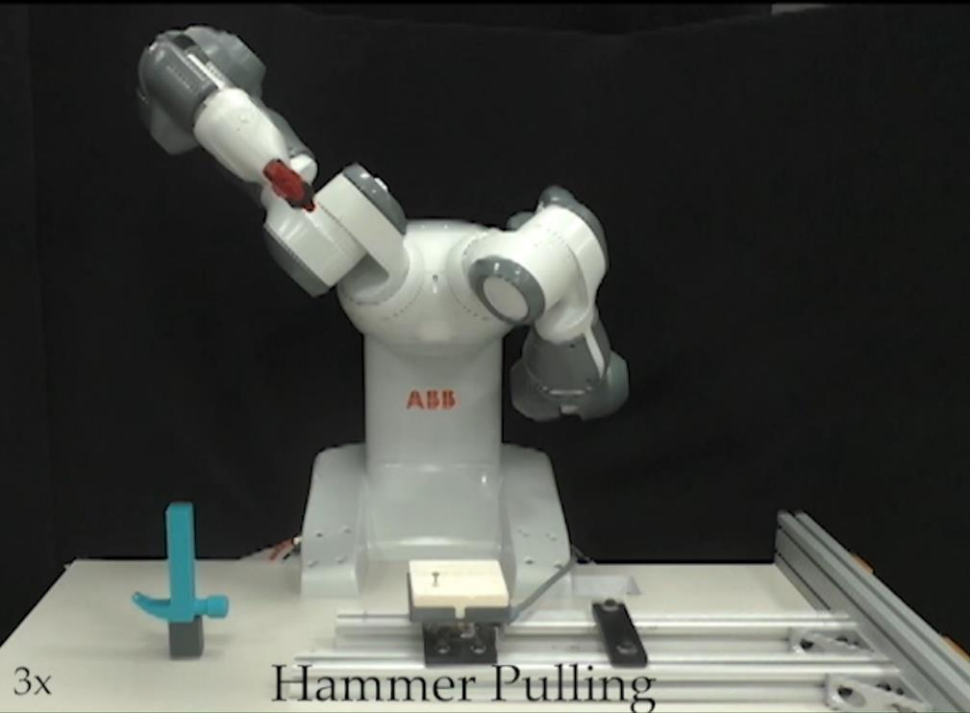


Experiments

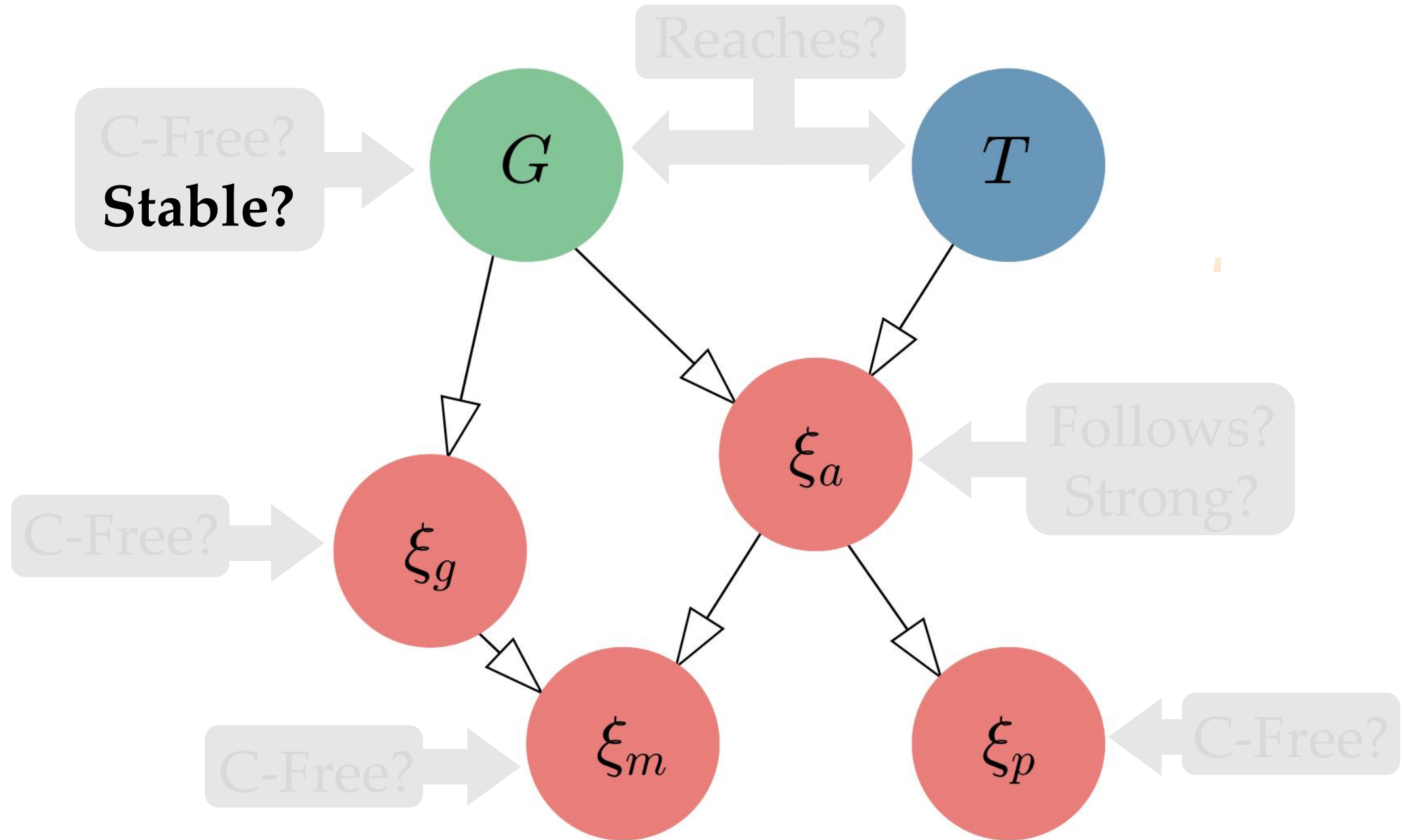


Assumptions

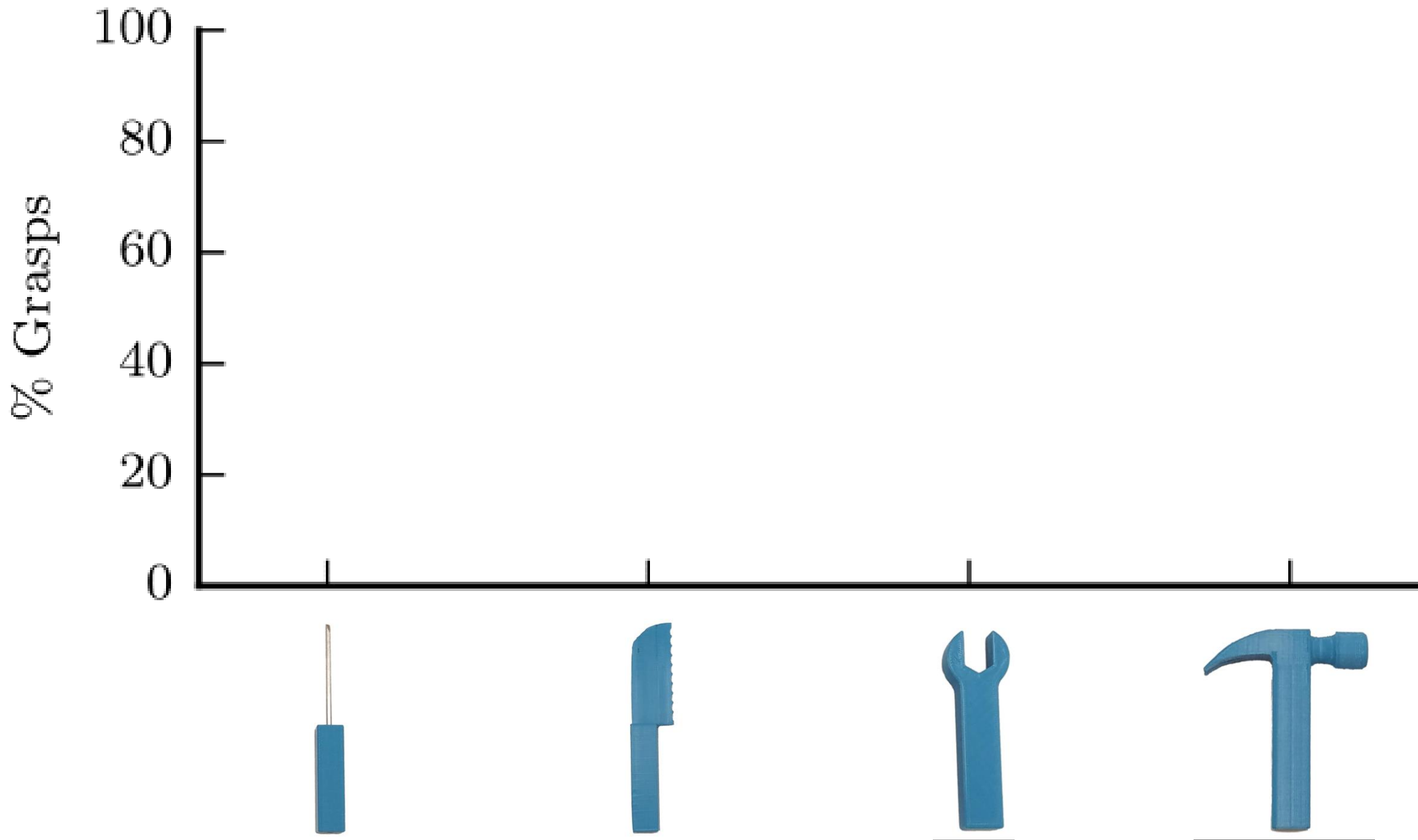


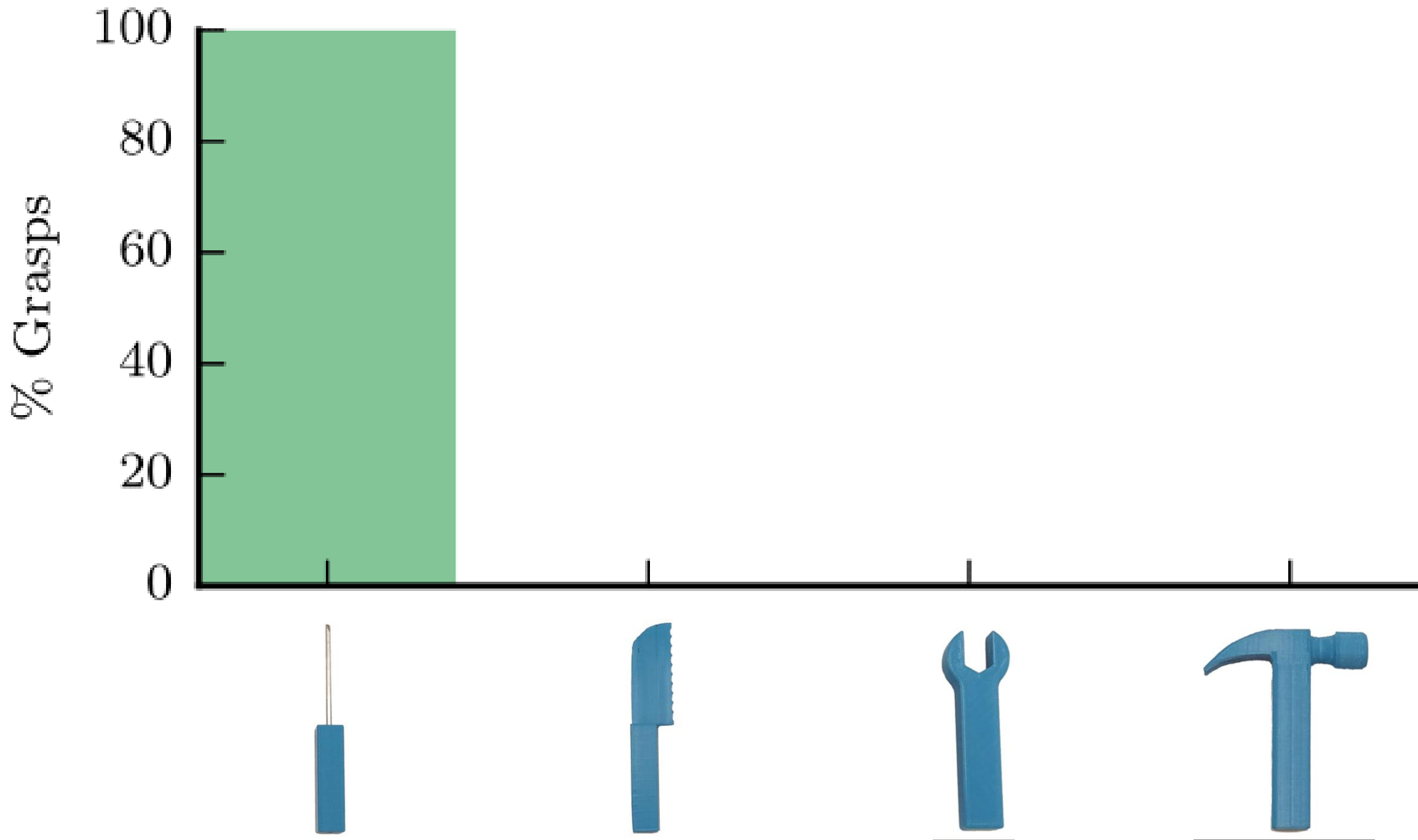


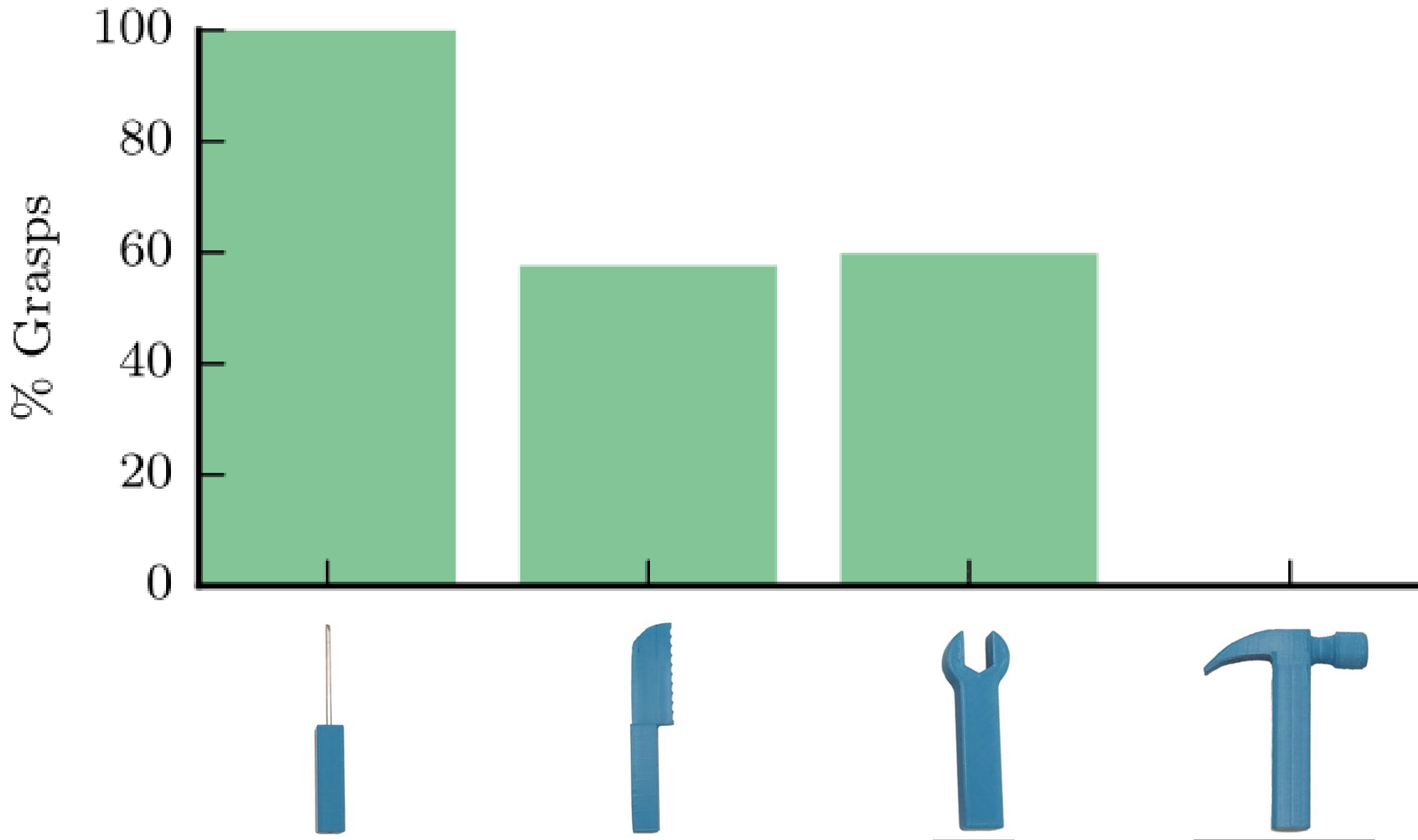
Applied
to four
tasks

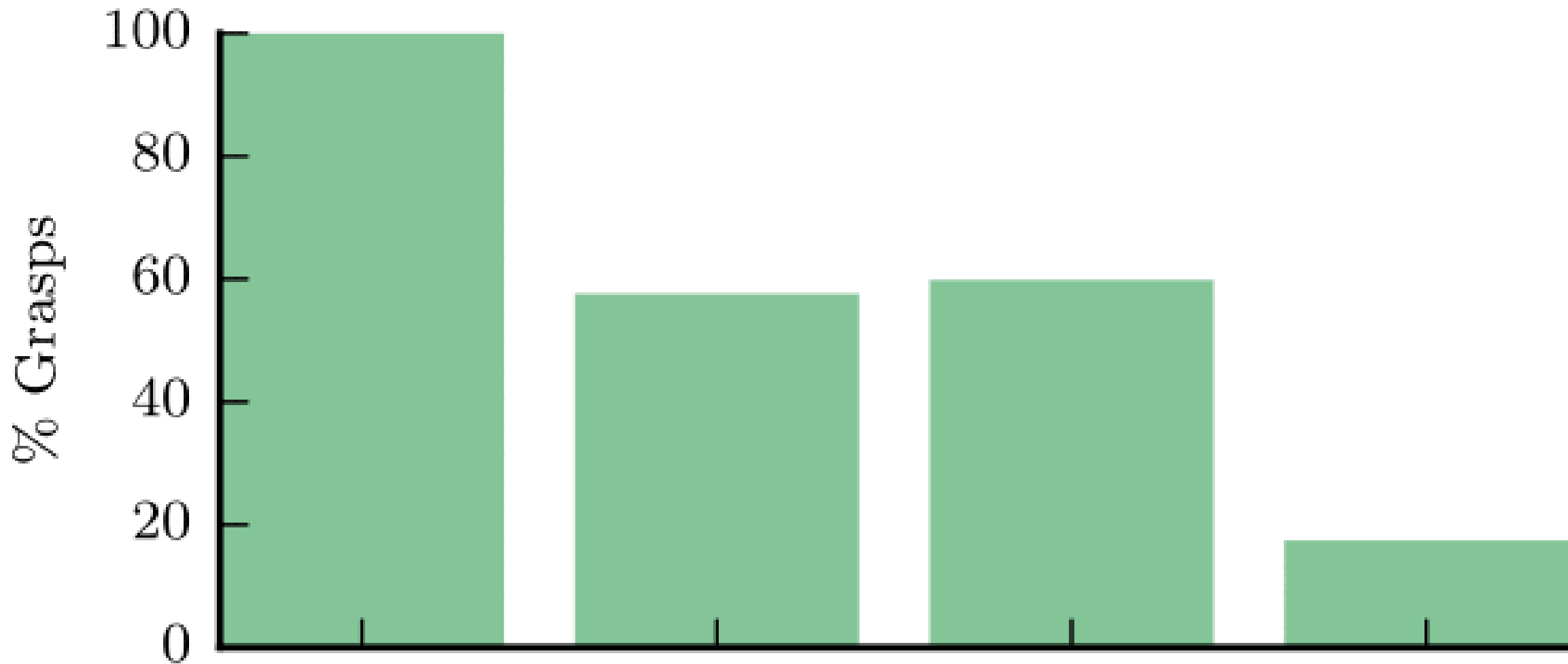


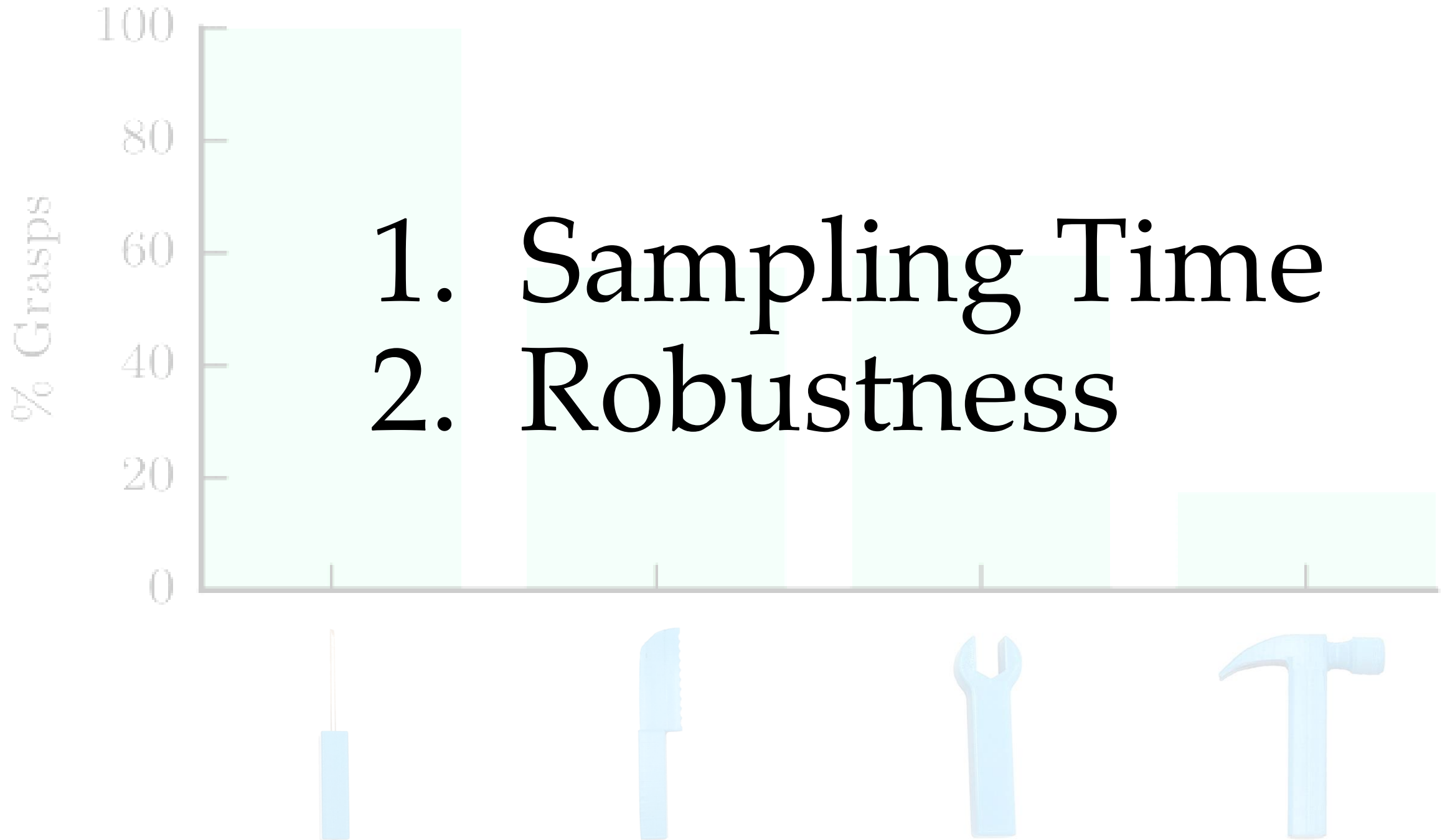


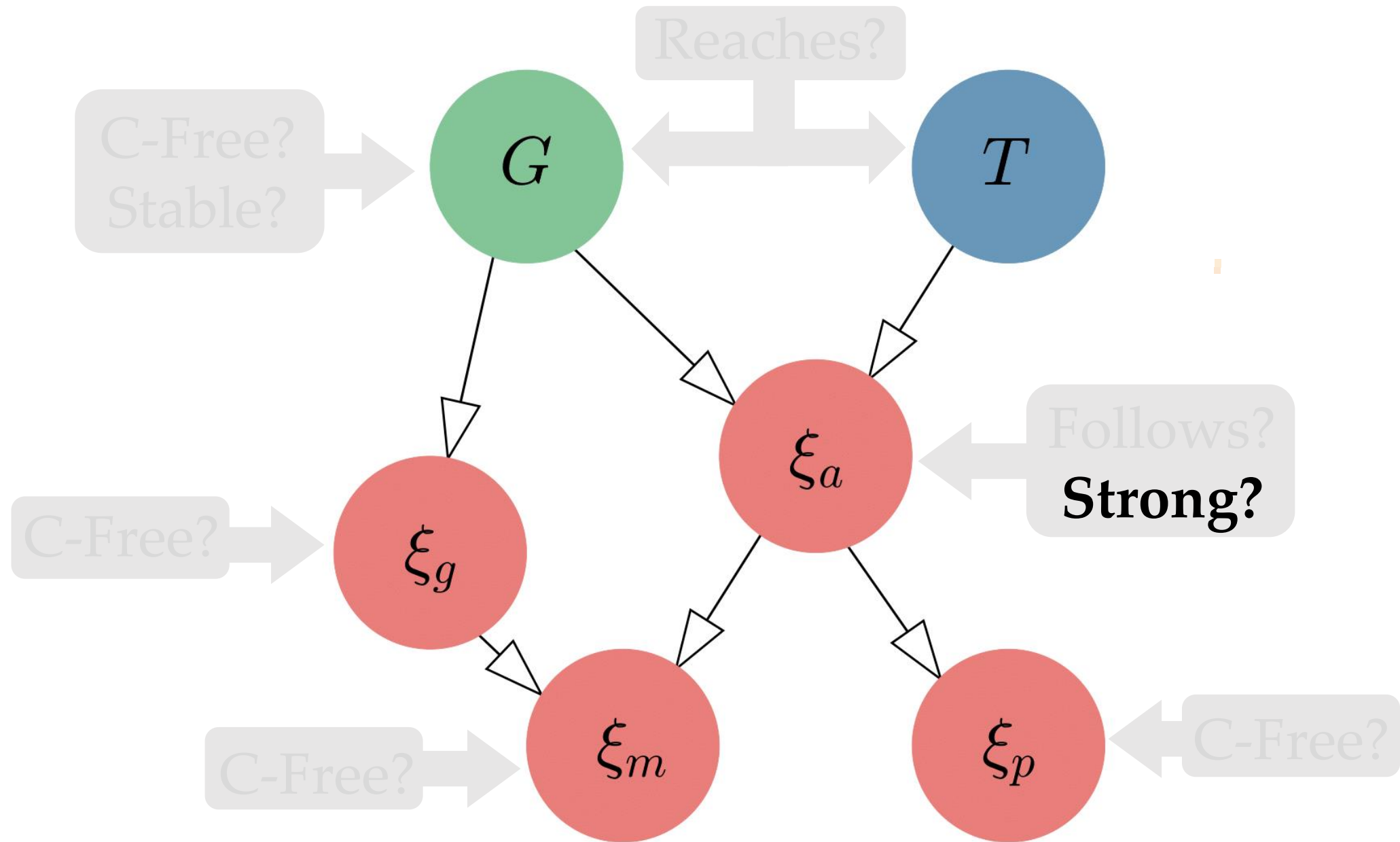


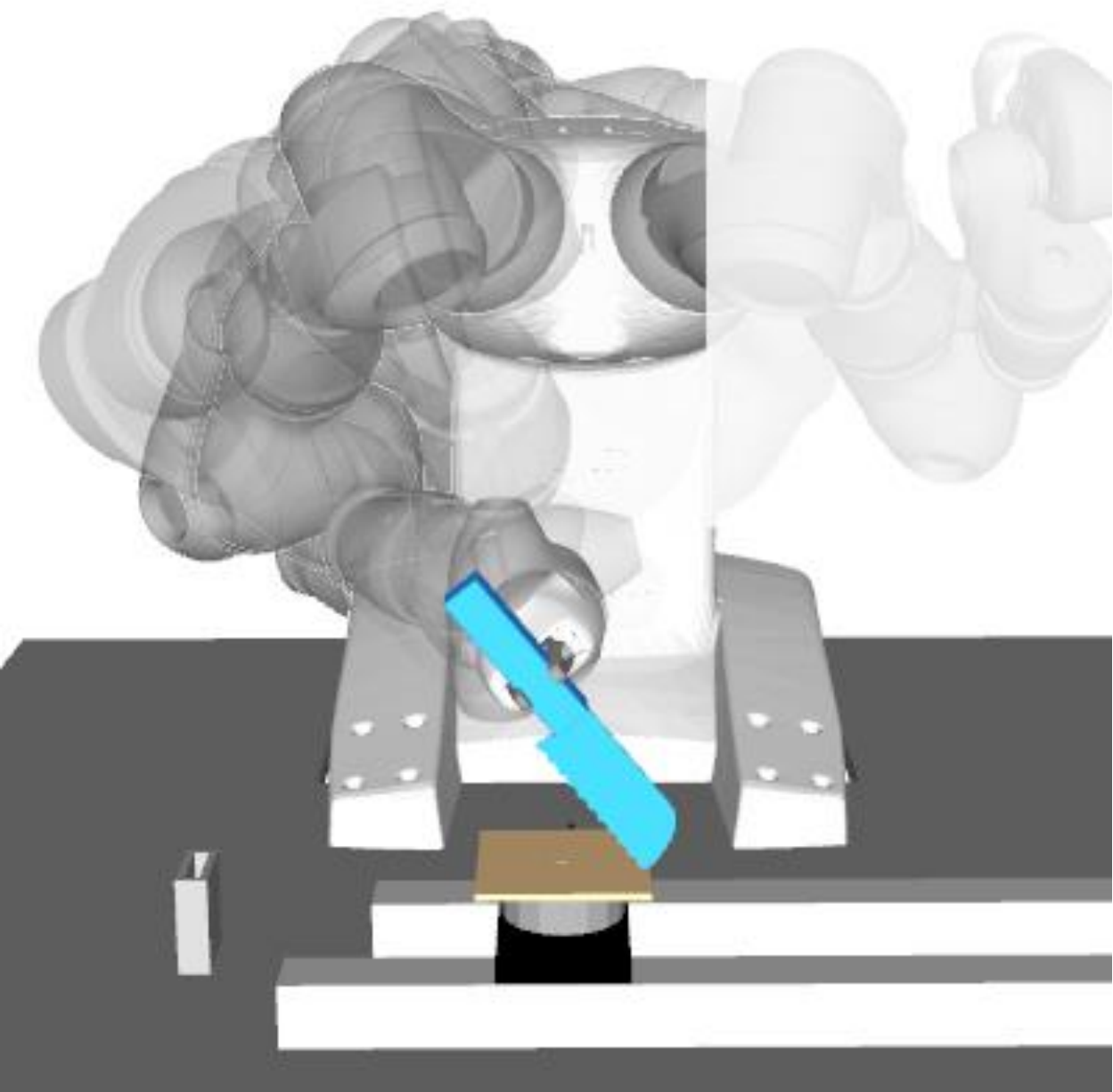


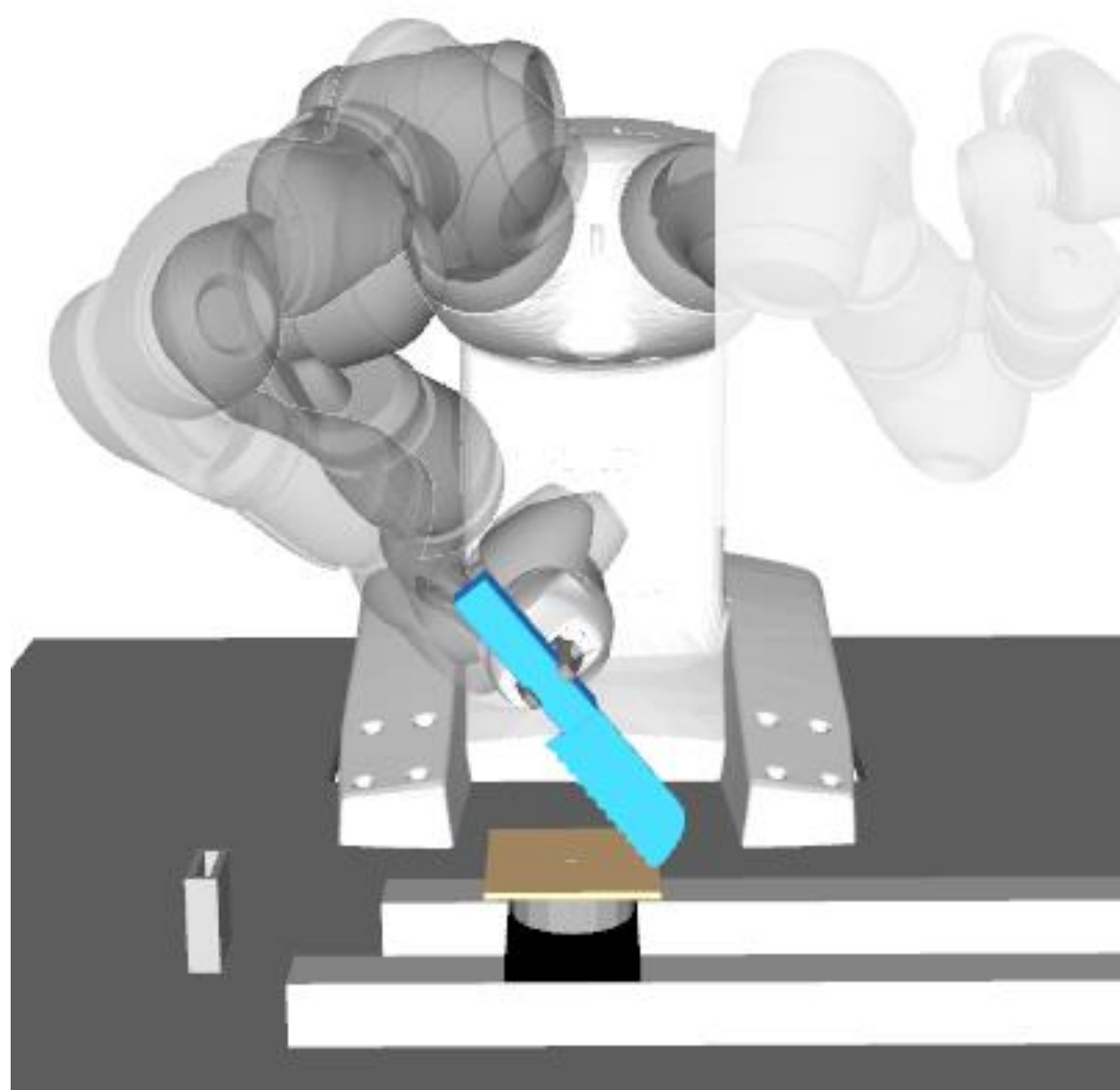
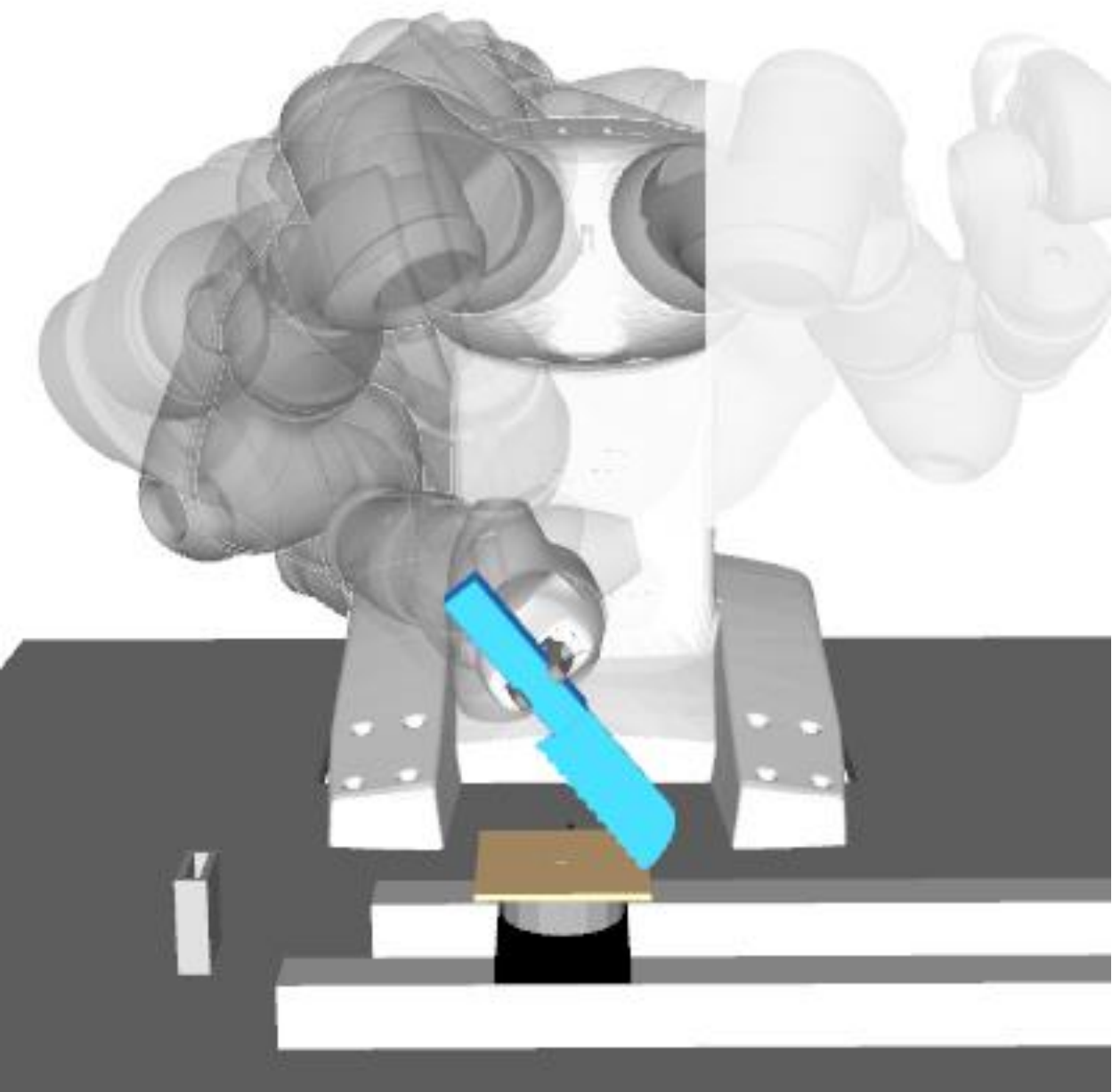


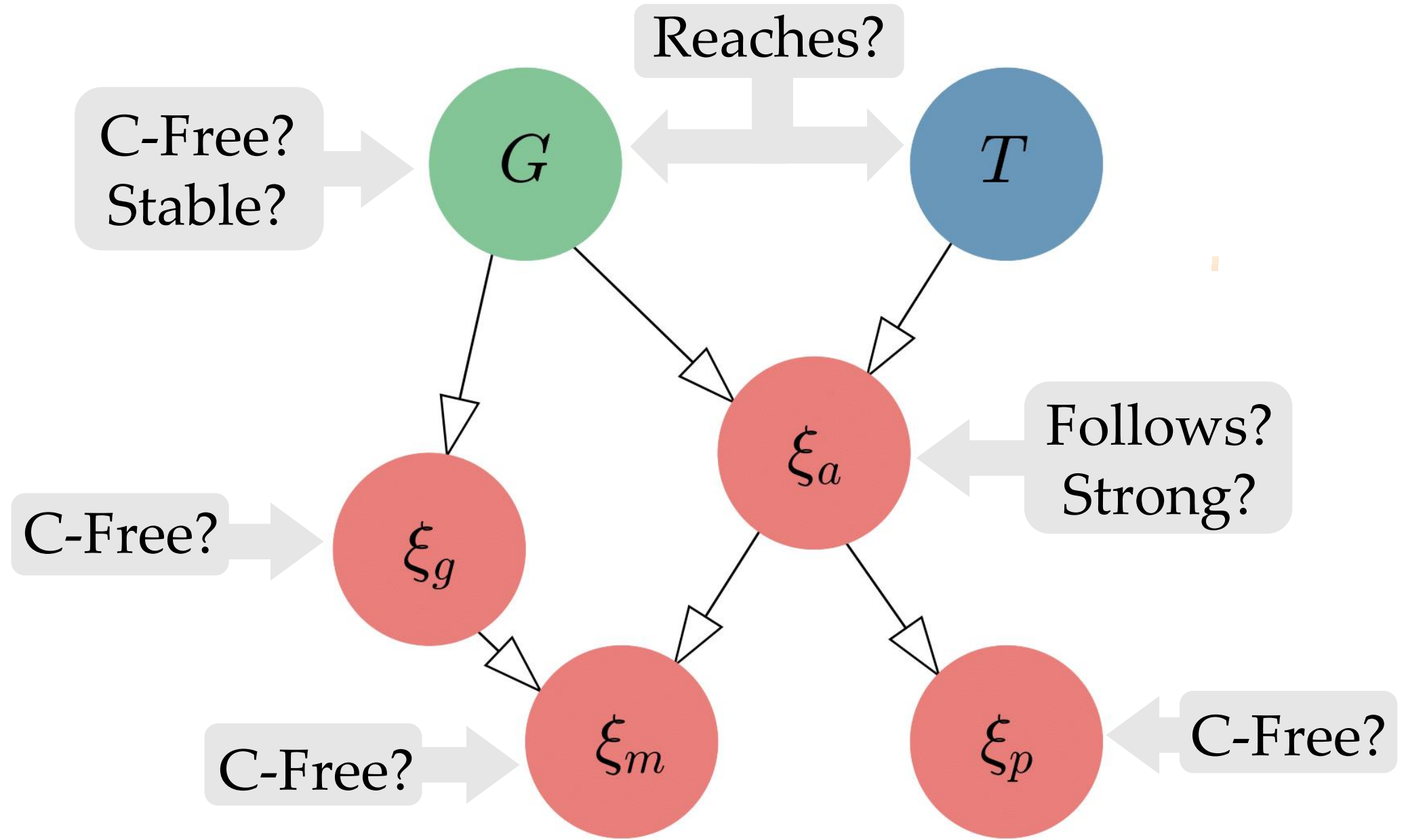




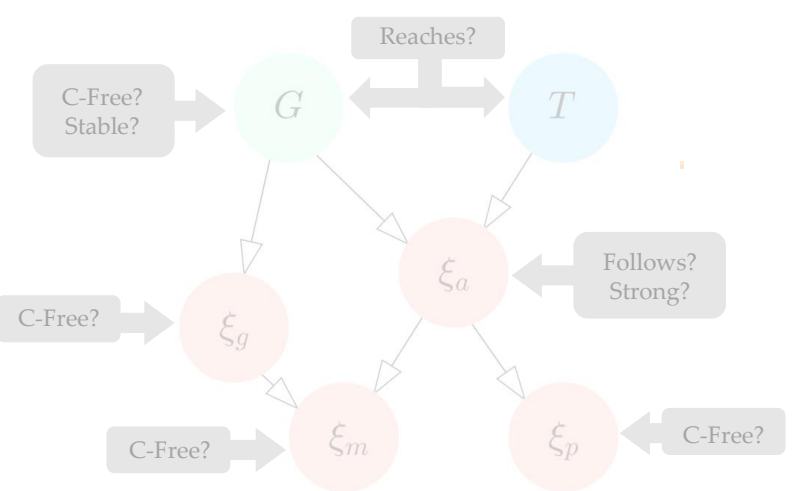




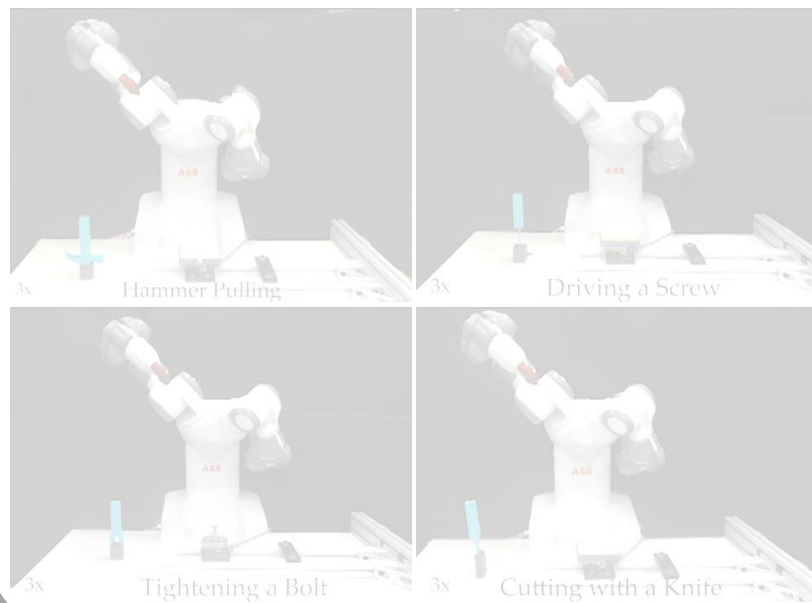




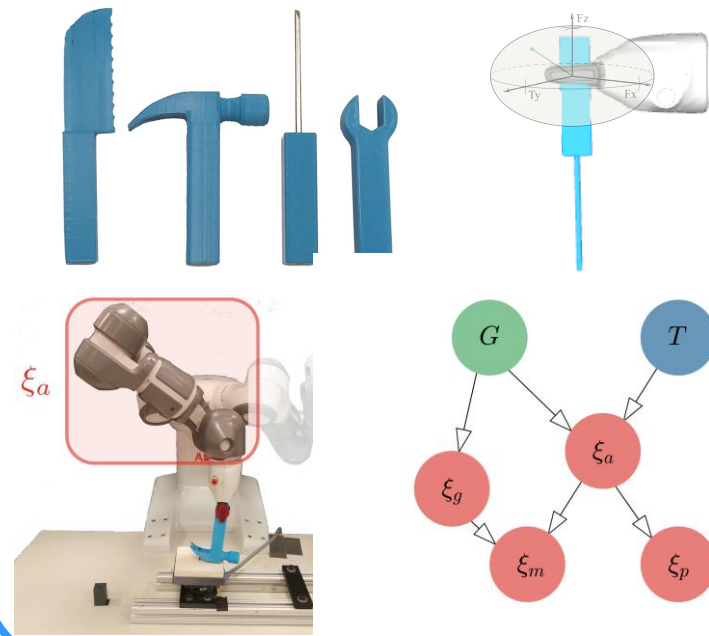
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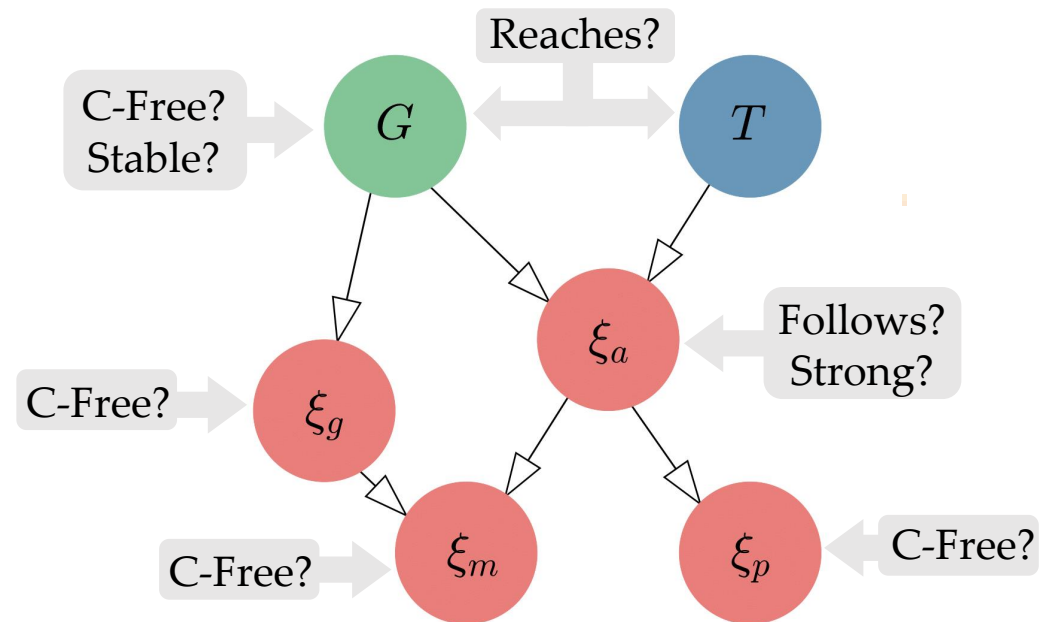
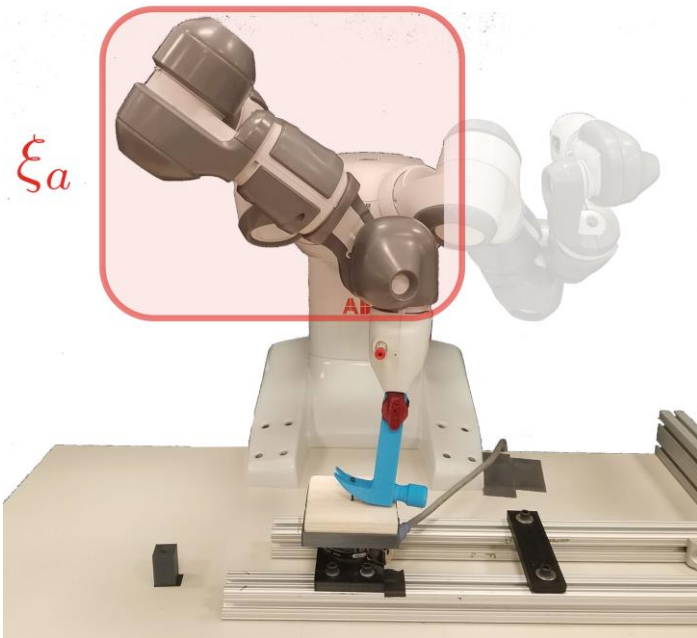
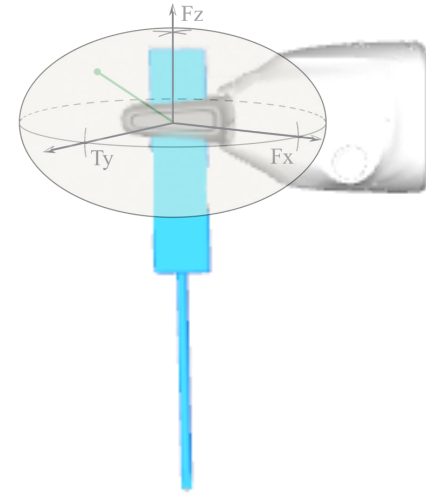
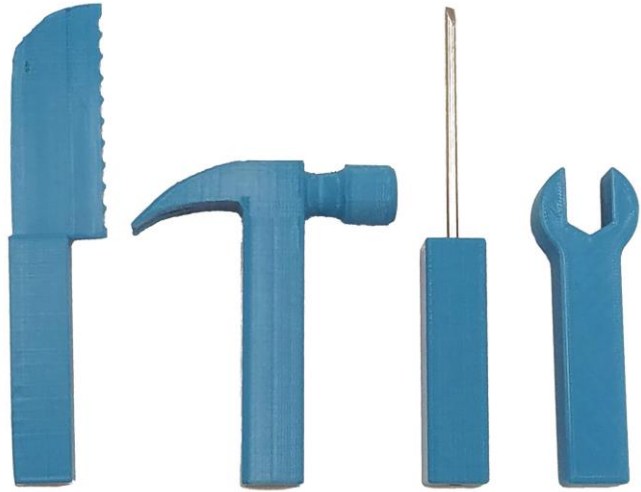
Experiments



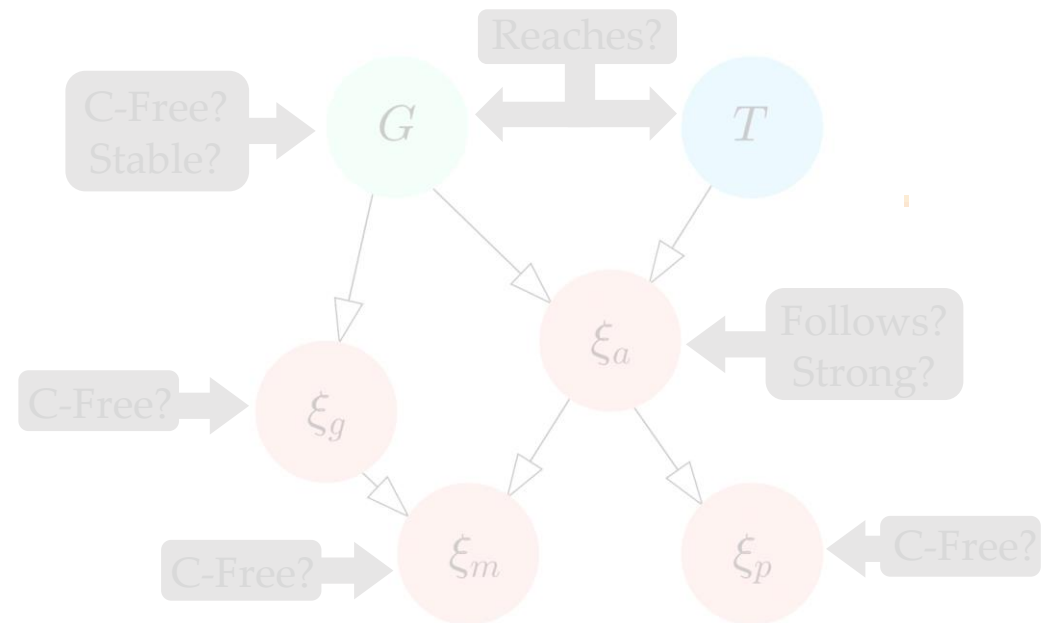
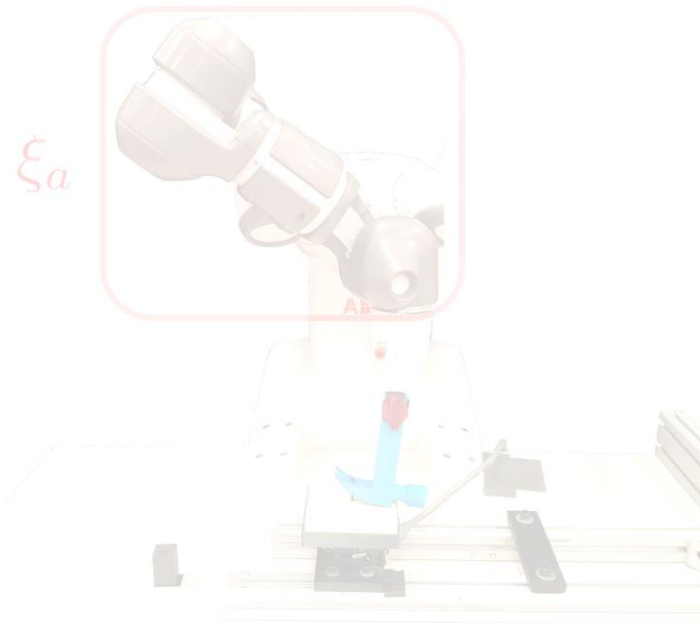
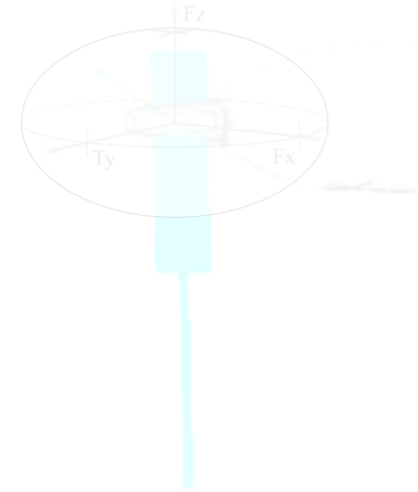
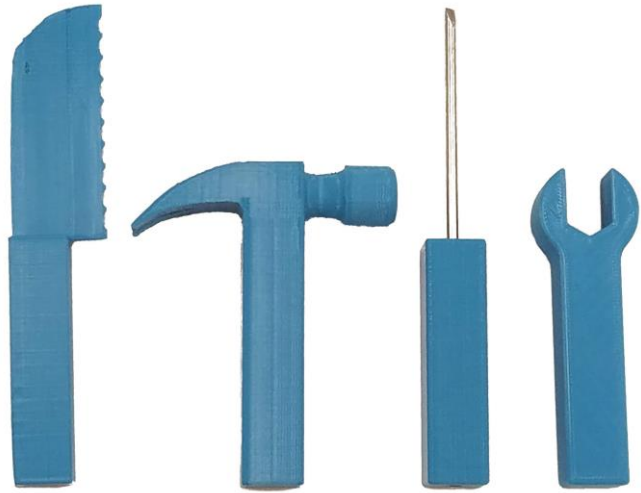
Assumptions



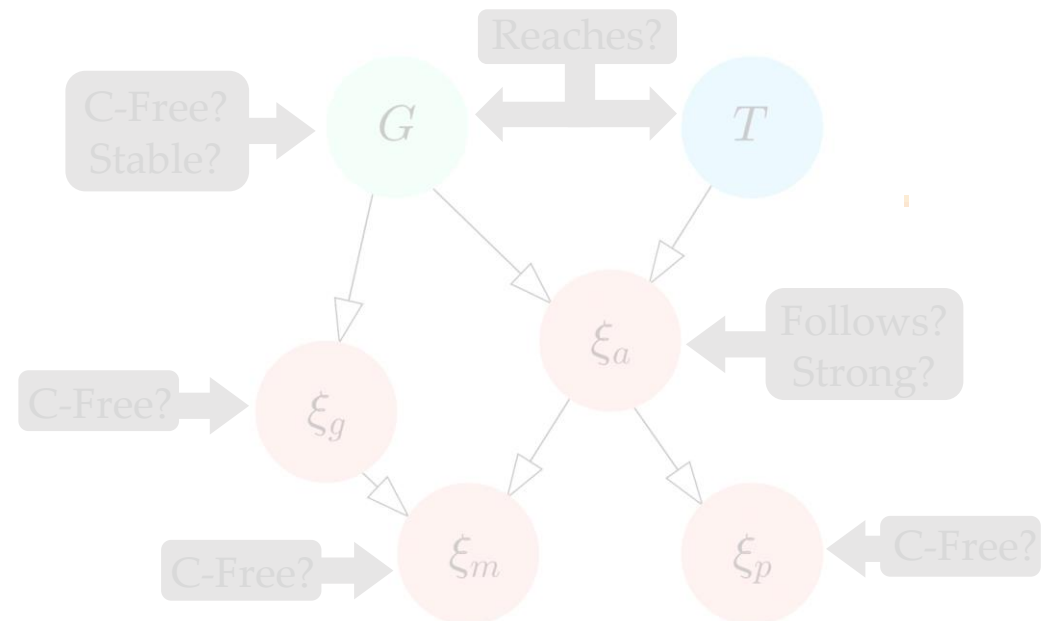
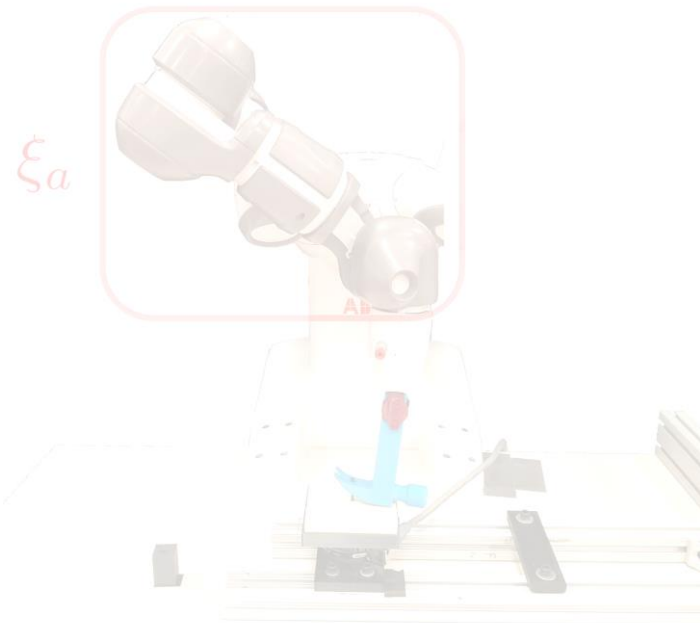
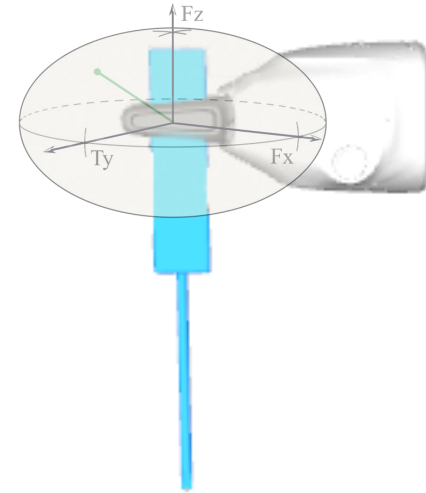
Assumptions



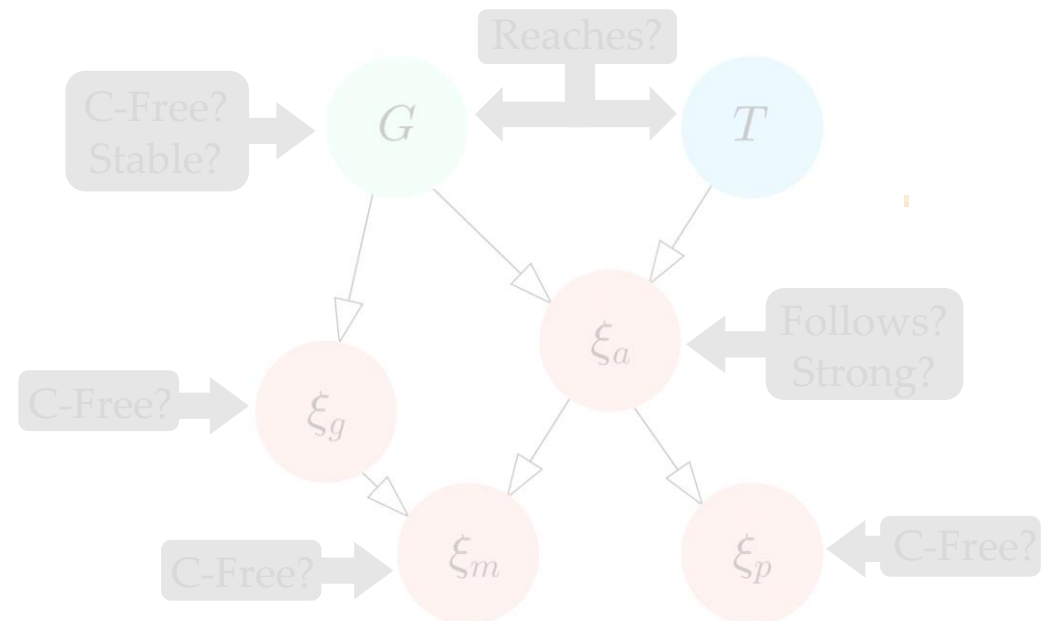
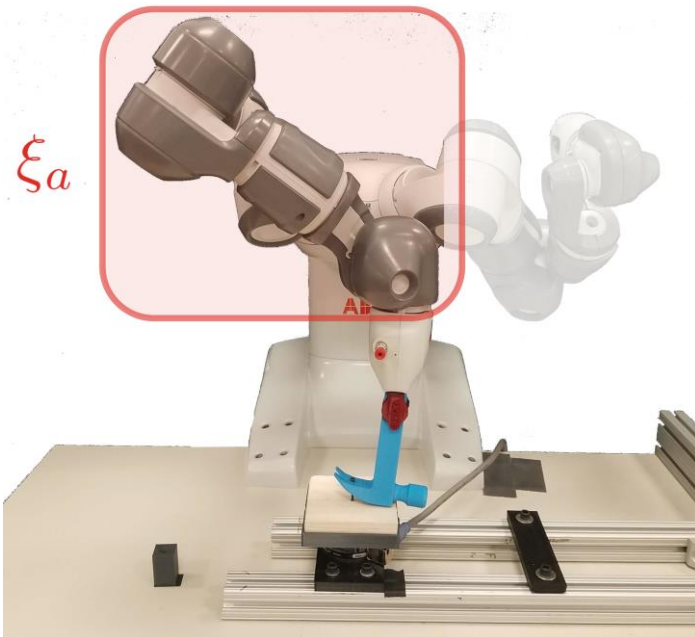
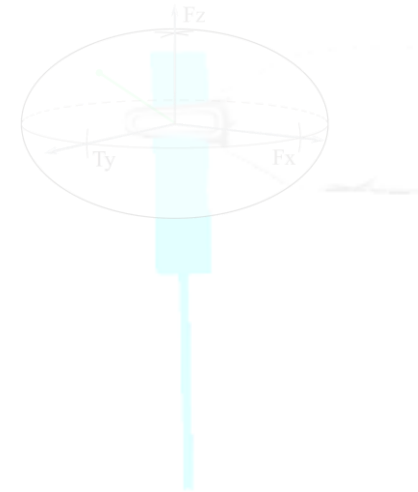
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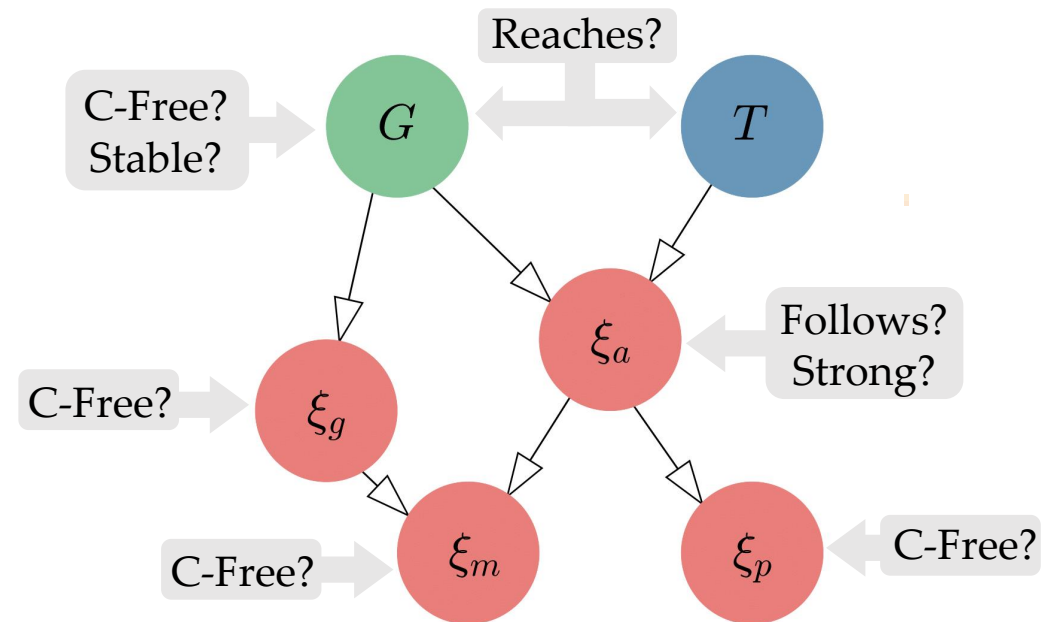
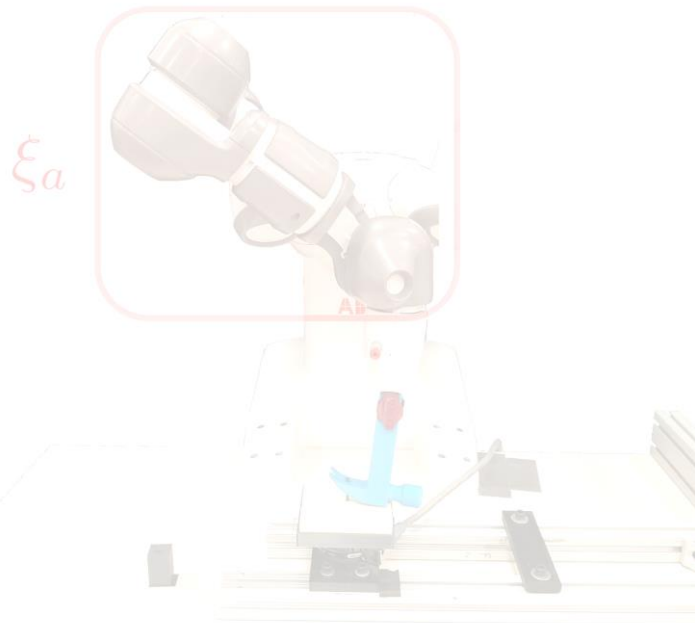
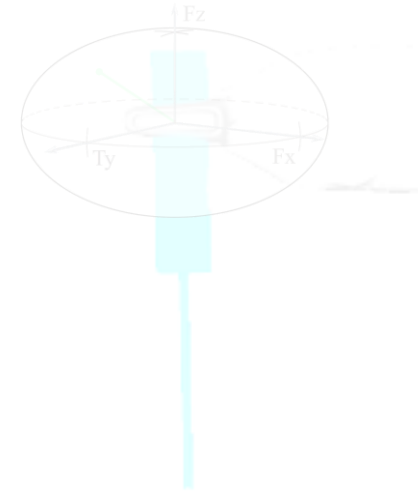
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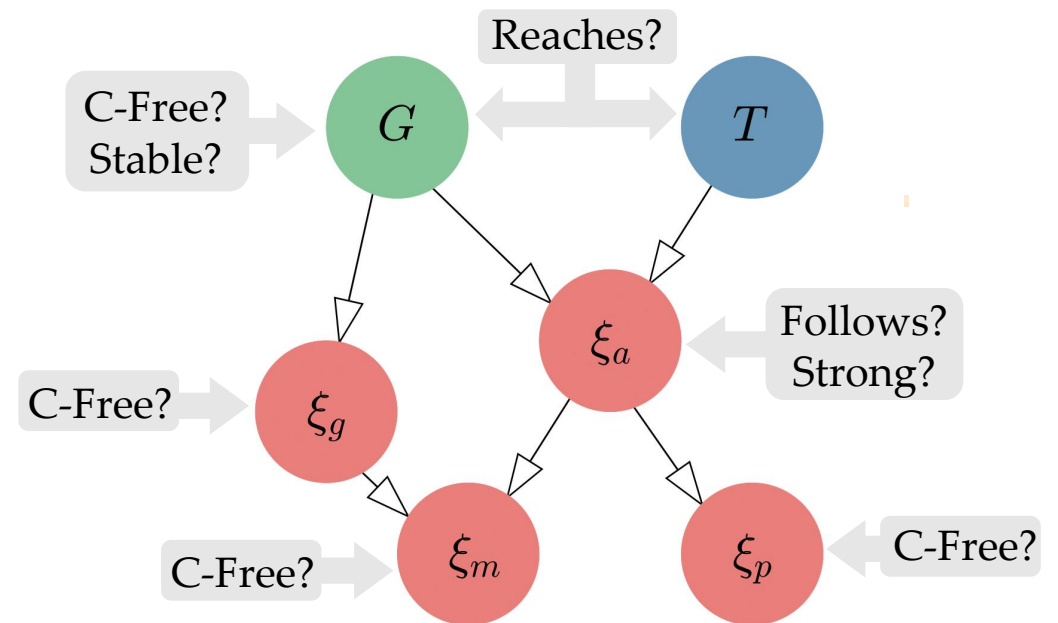
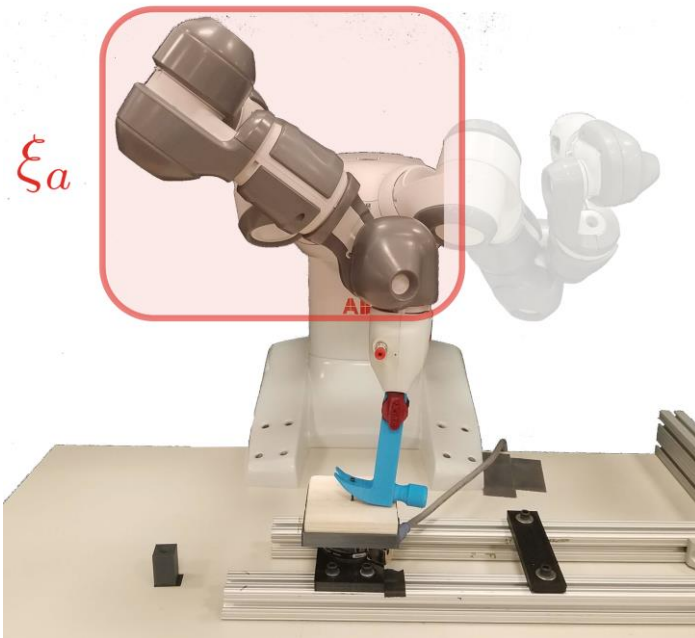
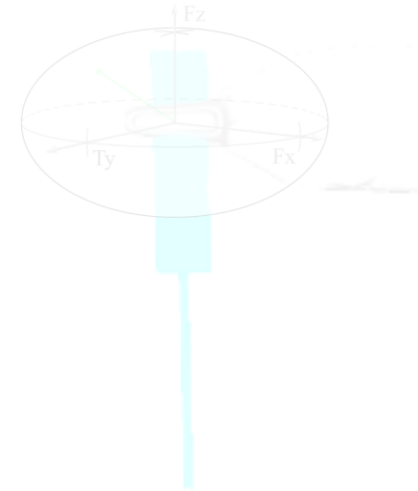
Assumptions



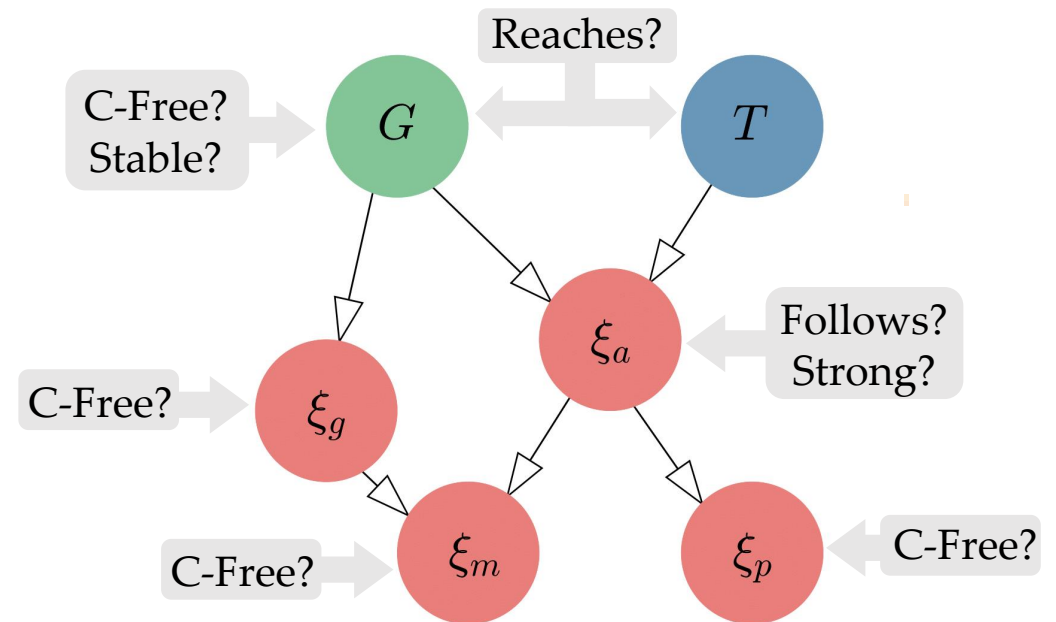
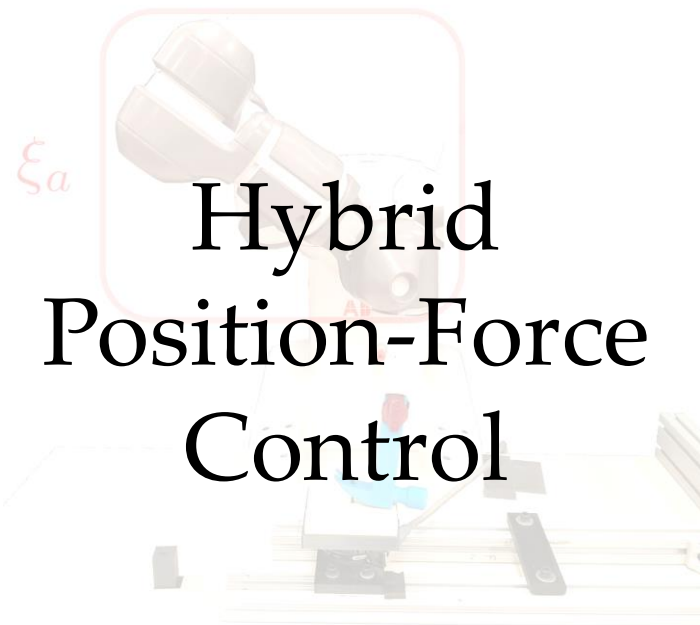
Assumptions



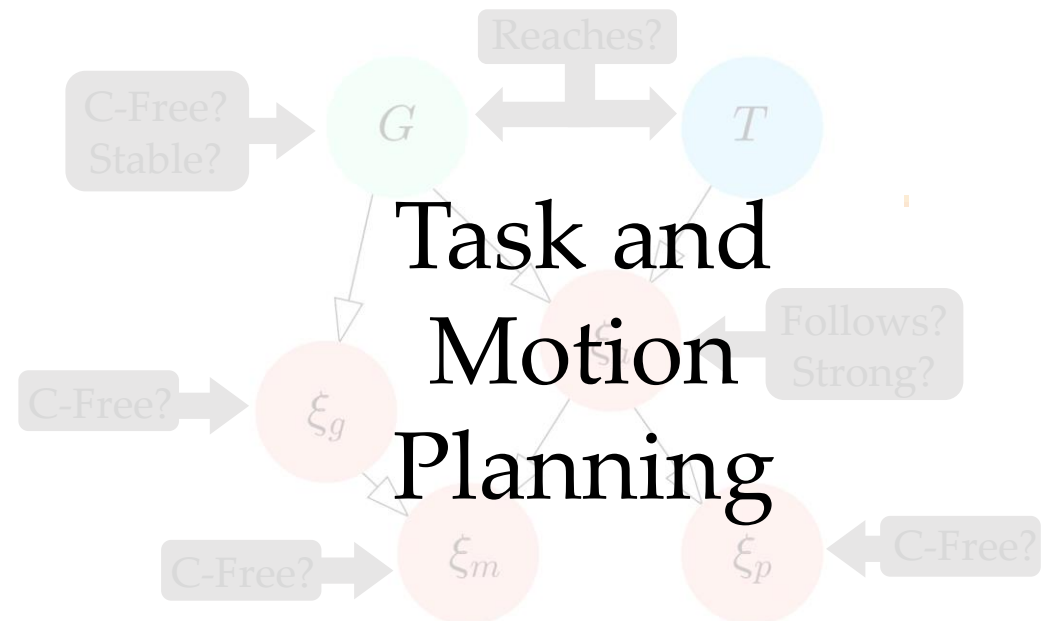
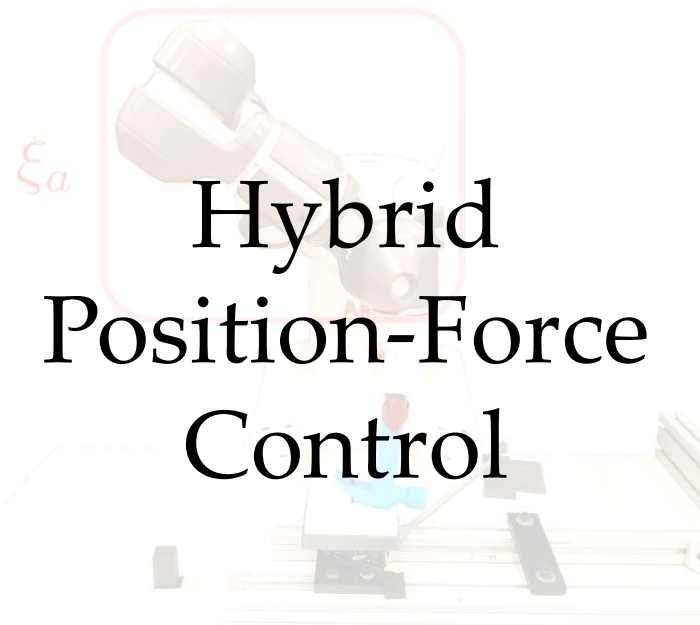
Assumptions



On-Going Work

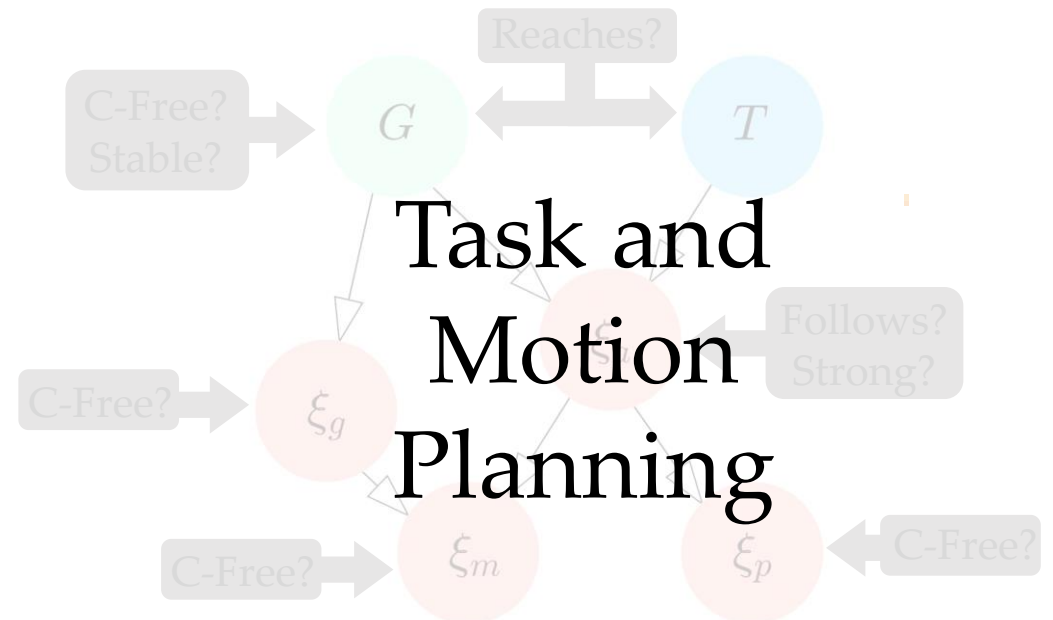
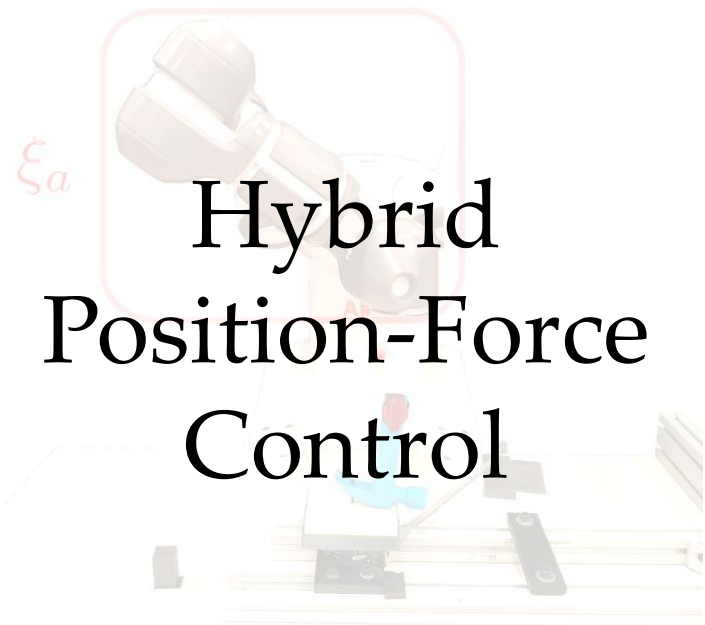


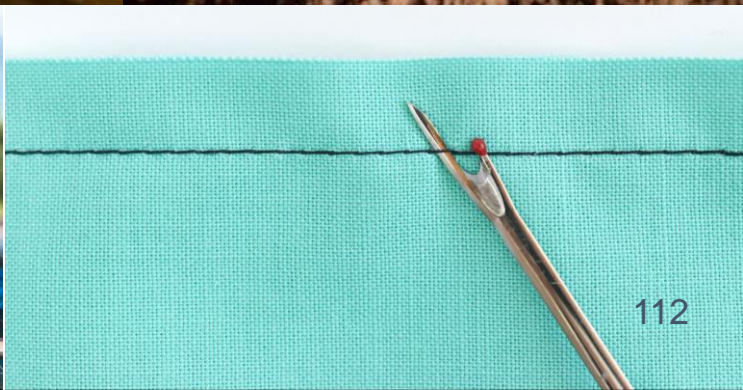
On-Going Work



On-Going Work

Force-and-Motion Constraints

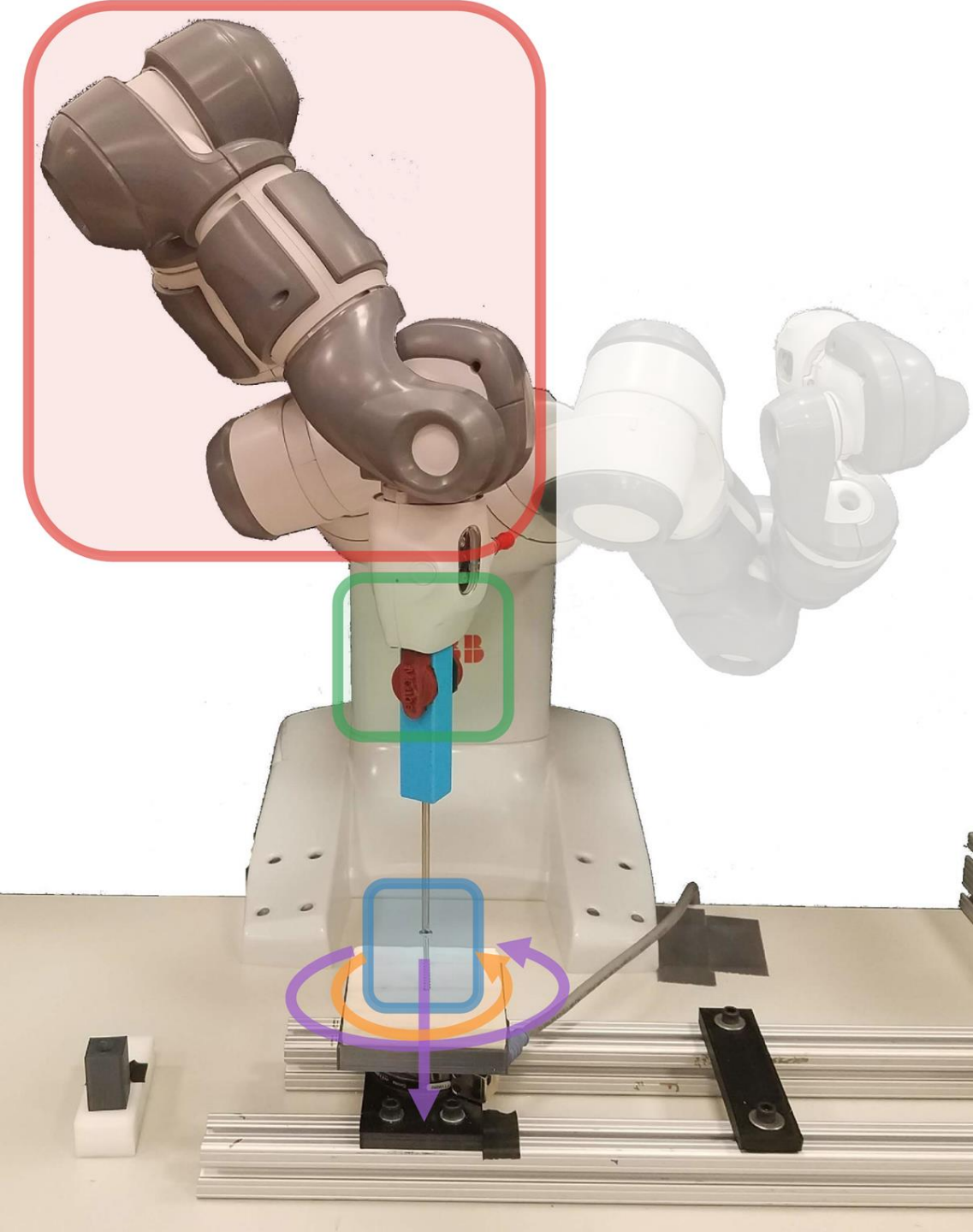




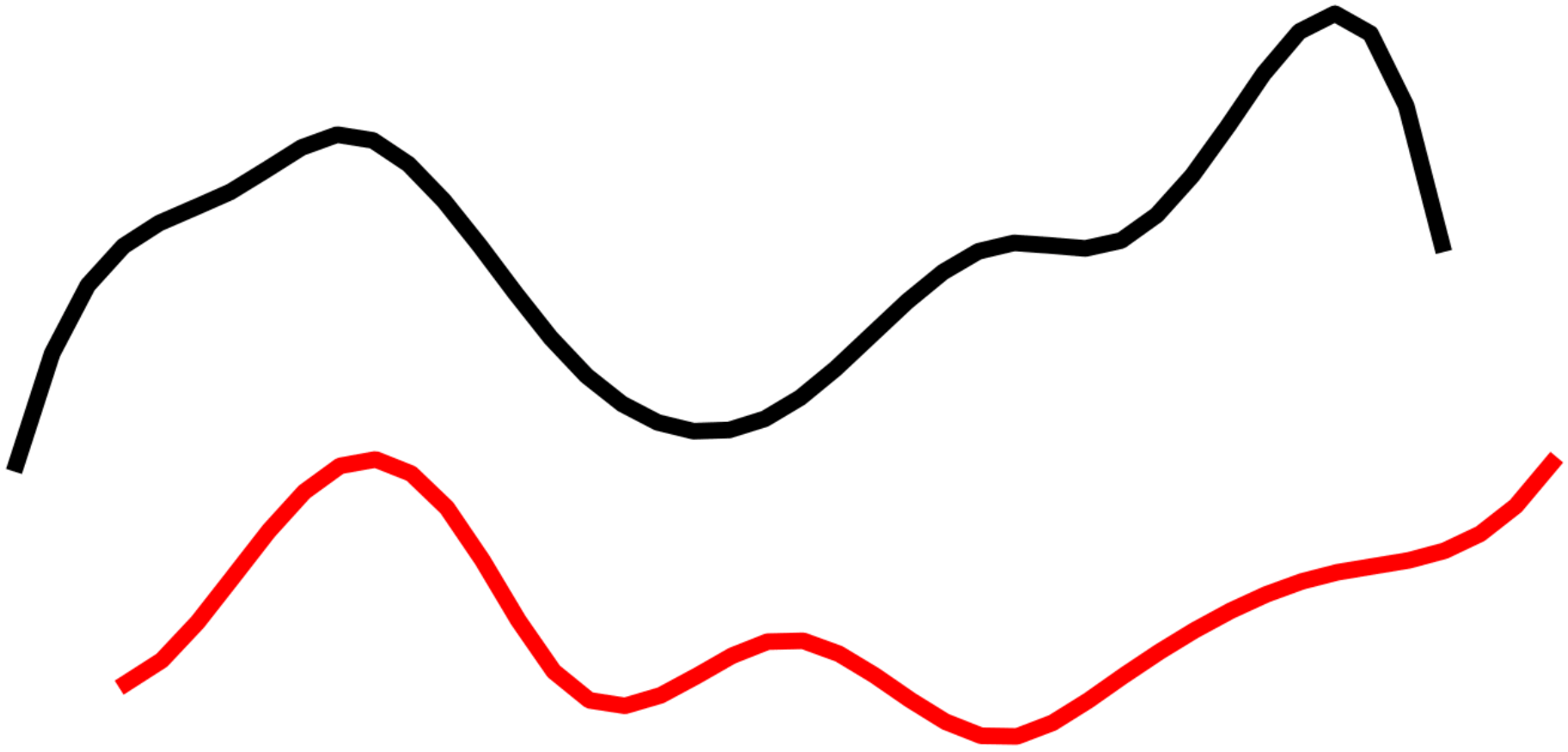
Force-and-Motion Constrained Planning for Tool Use

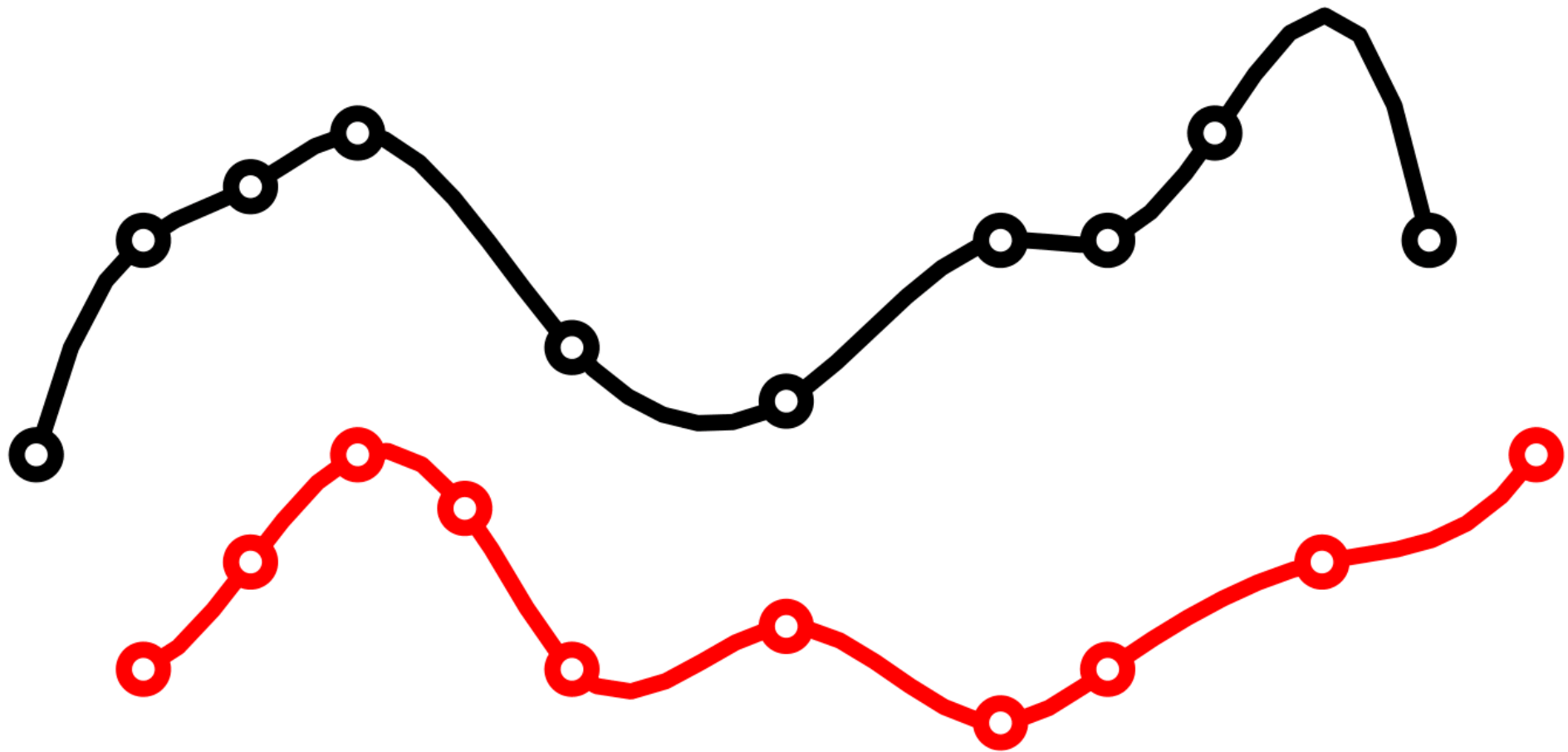
Rachel Holladay

Research Qualifying Exam
December 2019

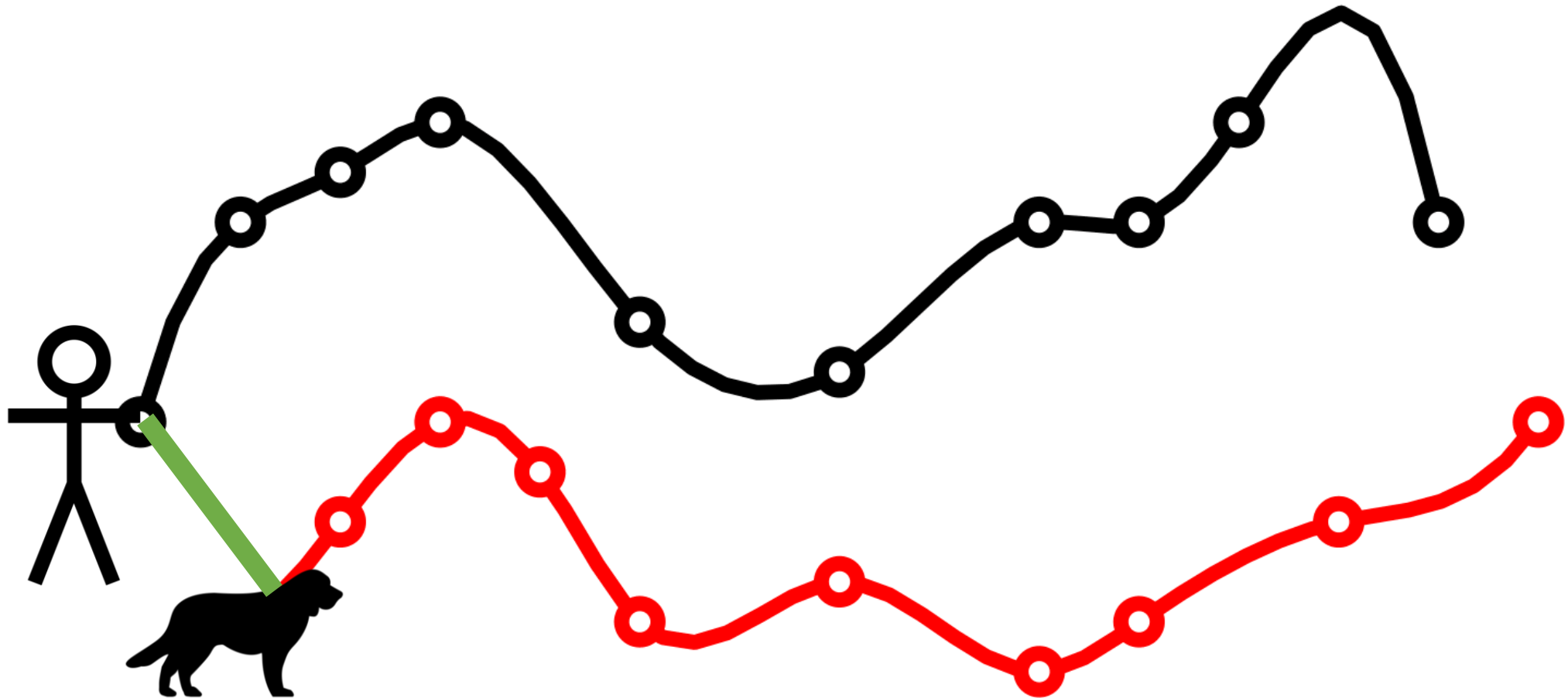


Back-Up Slides: Fréchet Distance





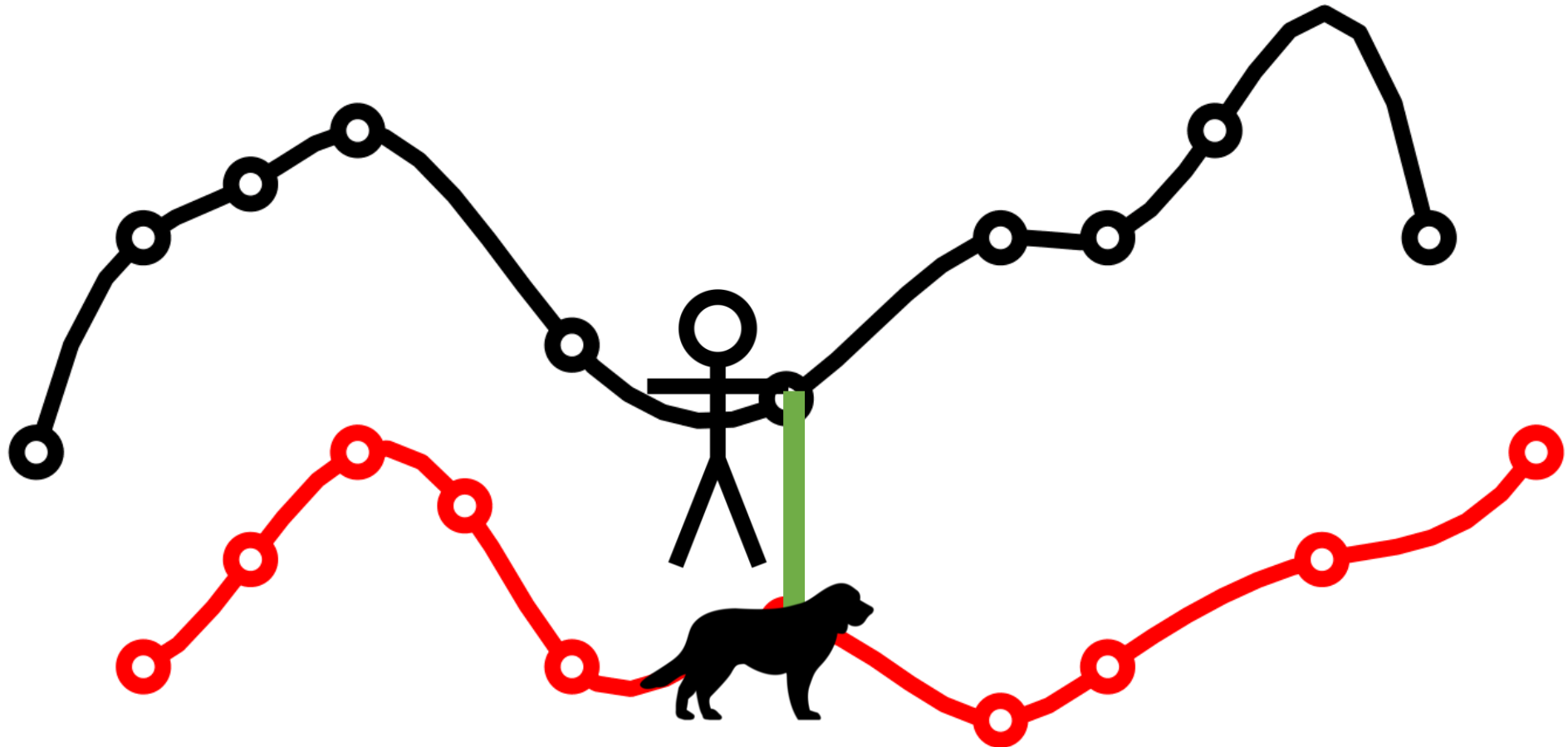
Fréchet Distance



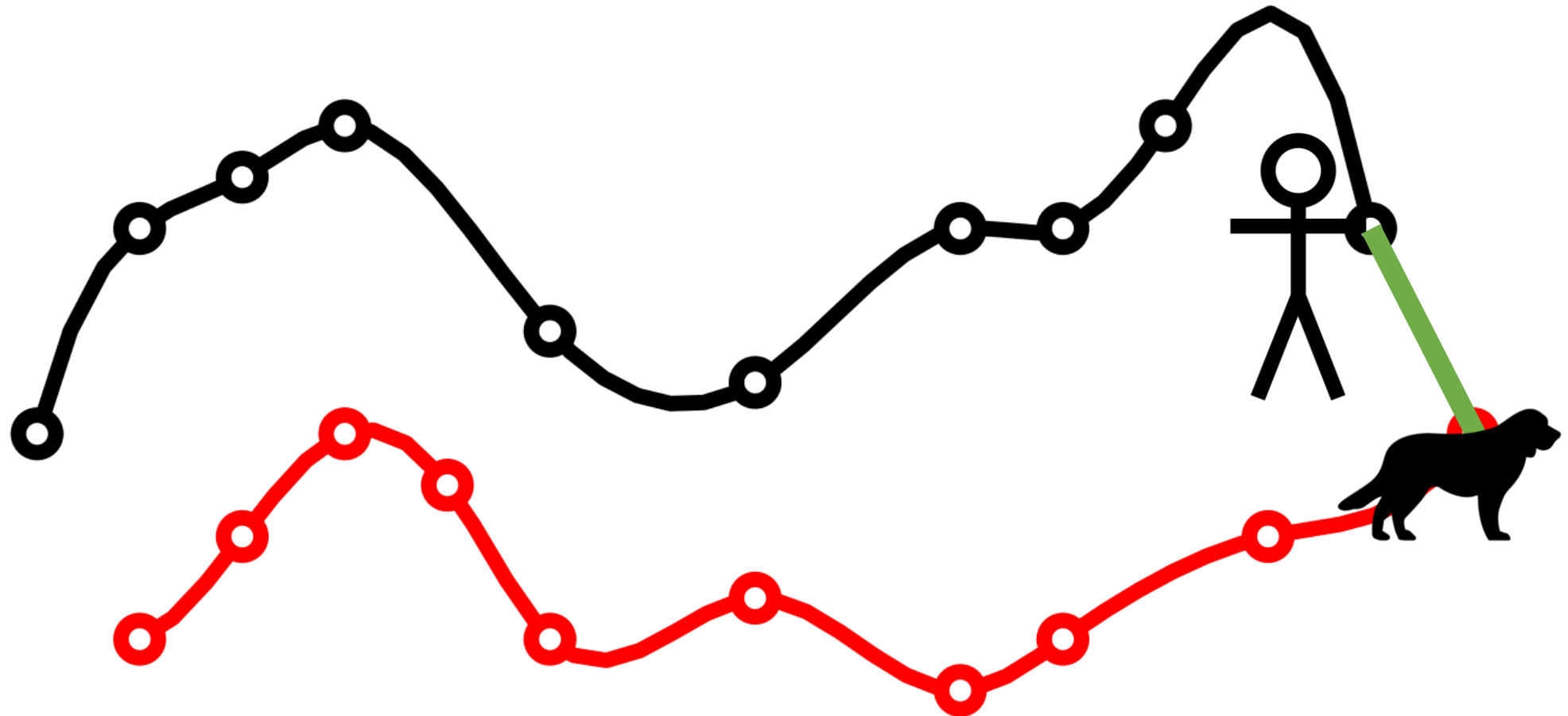
Fréchet Distance



Fréchet Distance

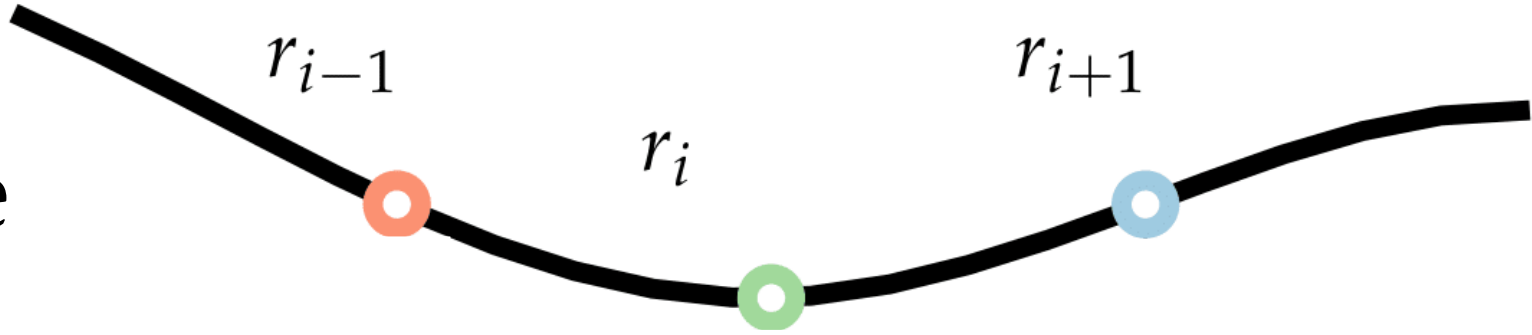


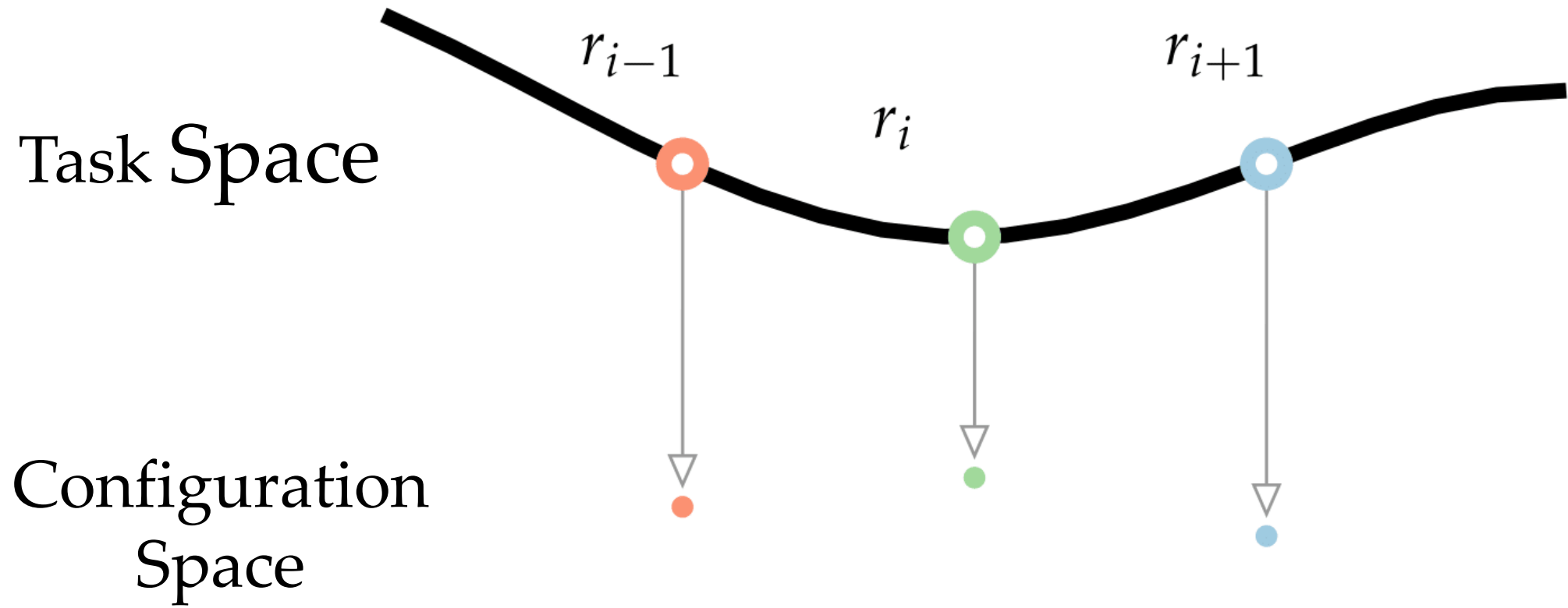
Fréchet Distance

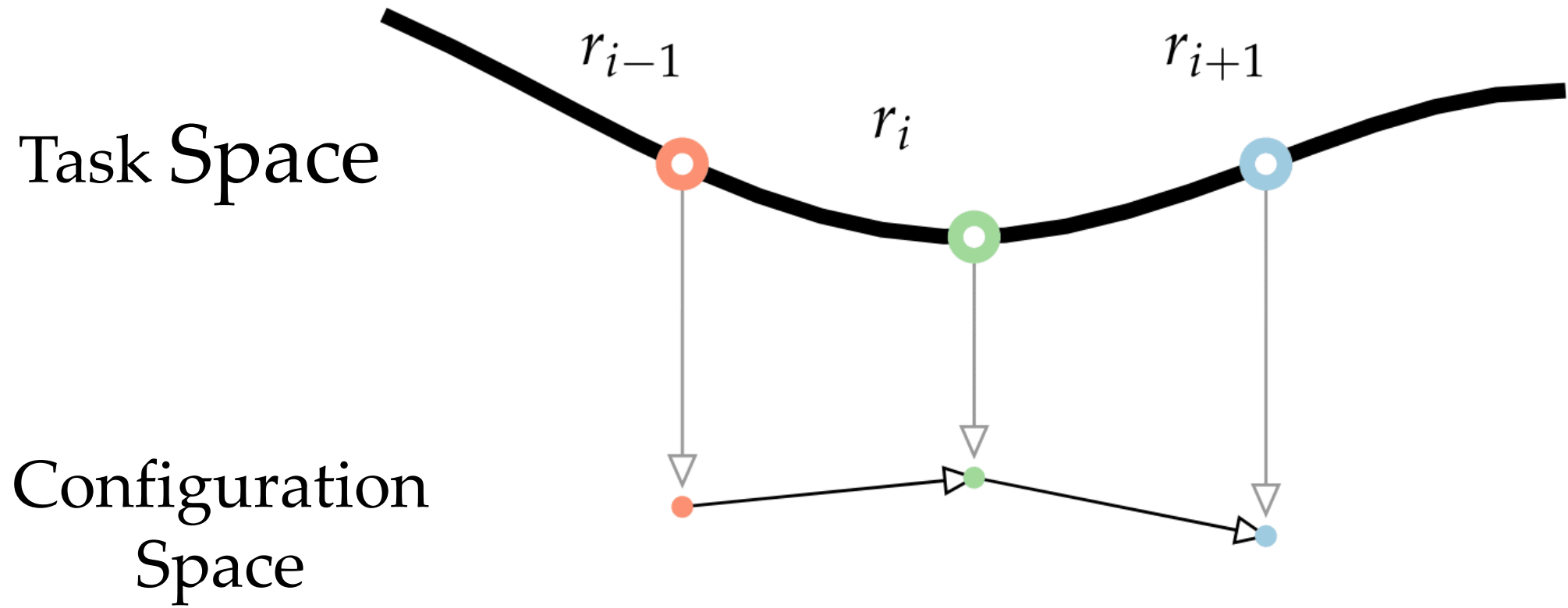


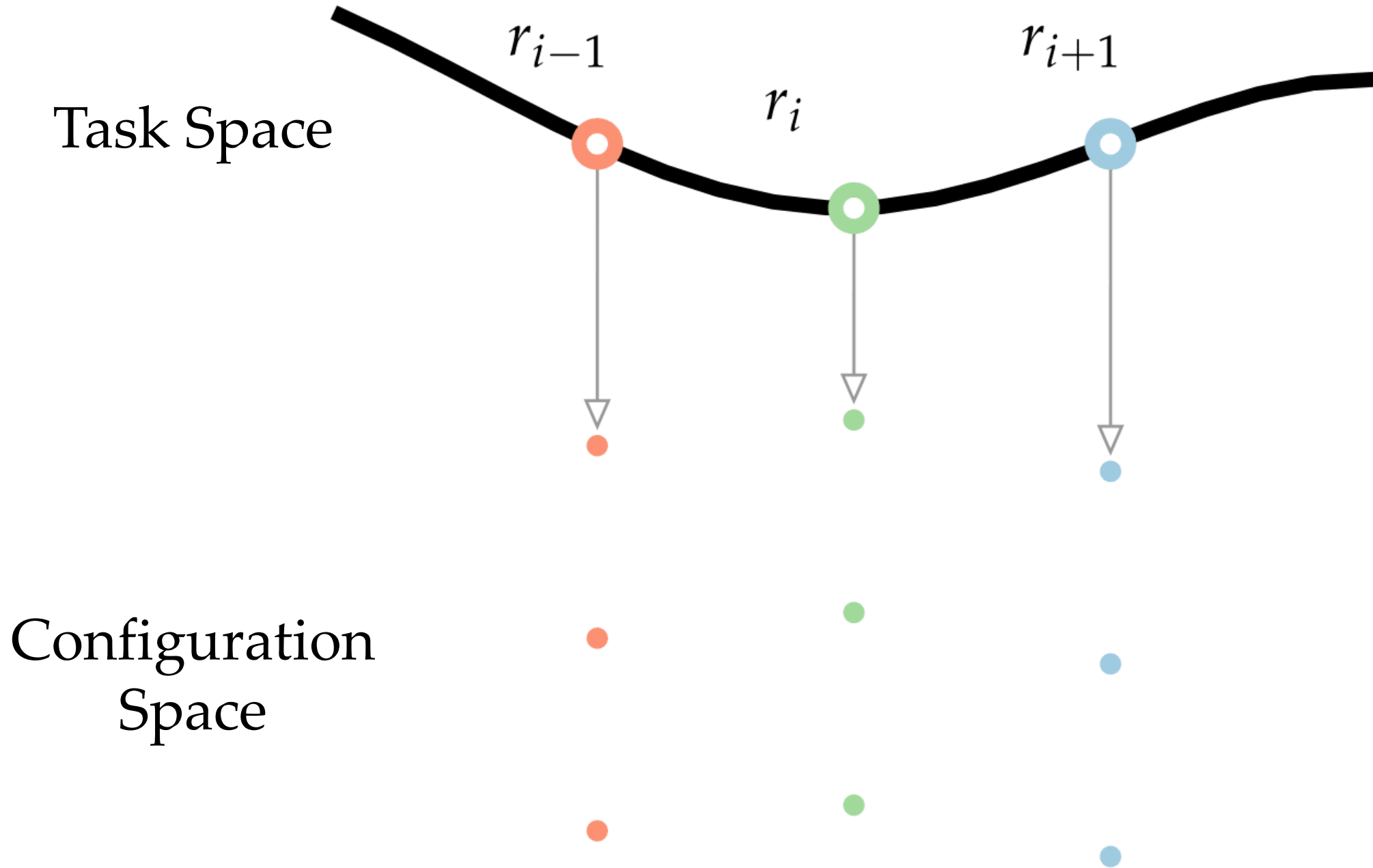
Back-Up Slides: Layered Graph

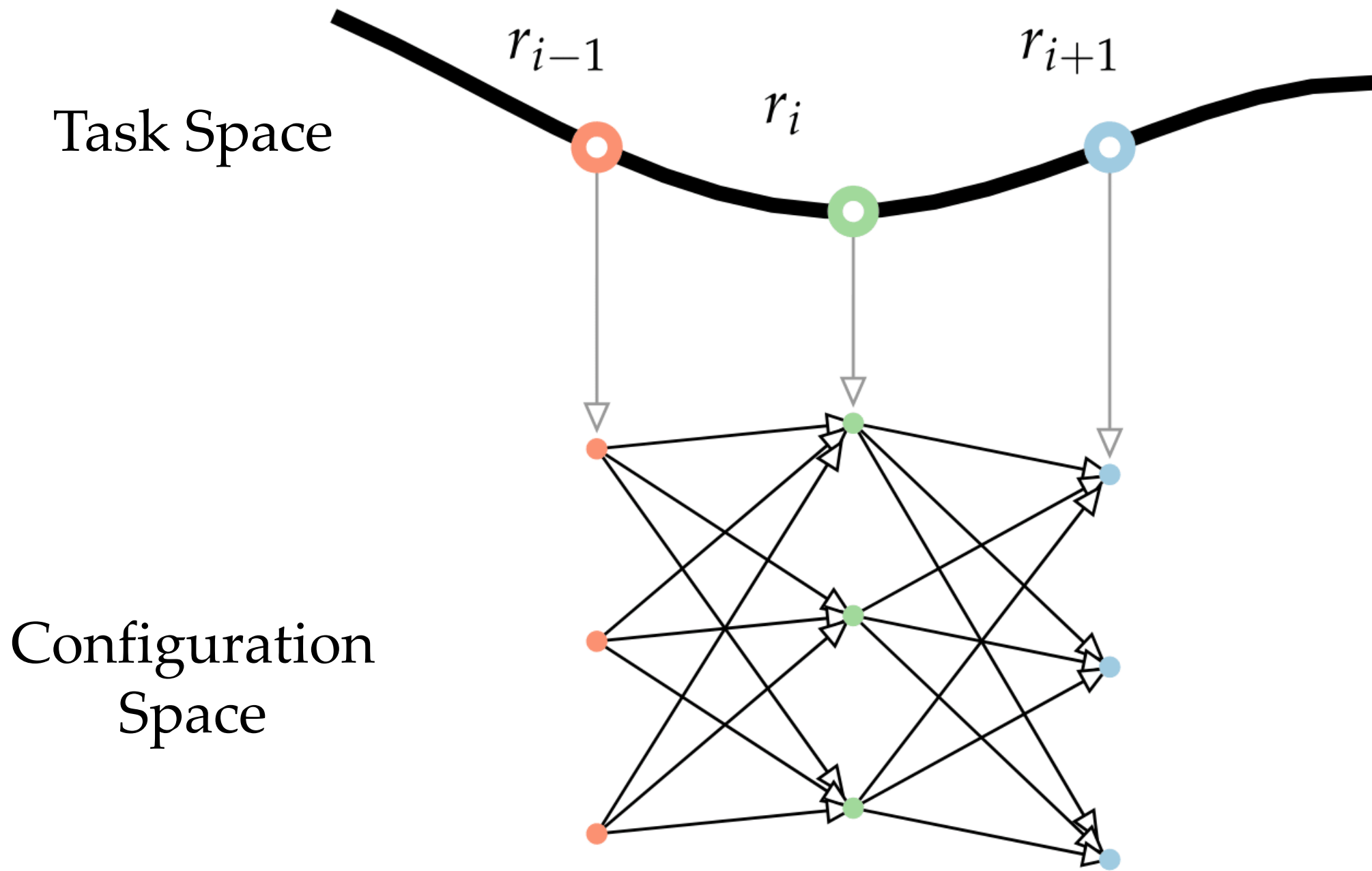
Task Space

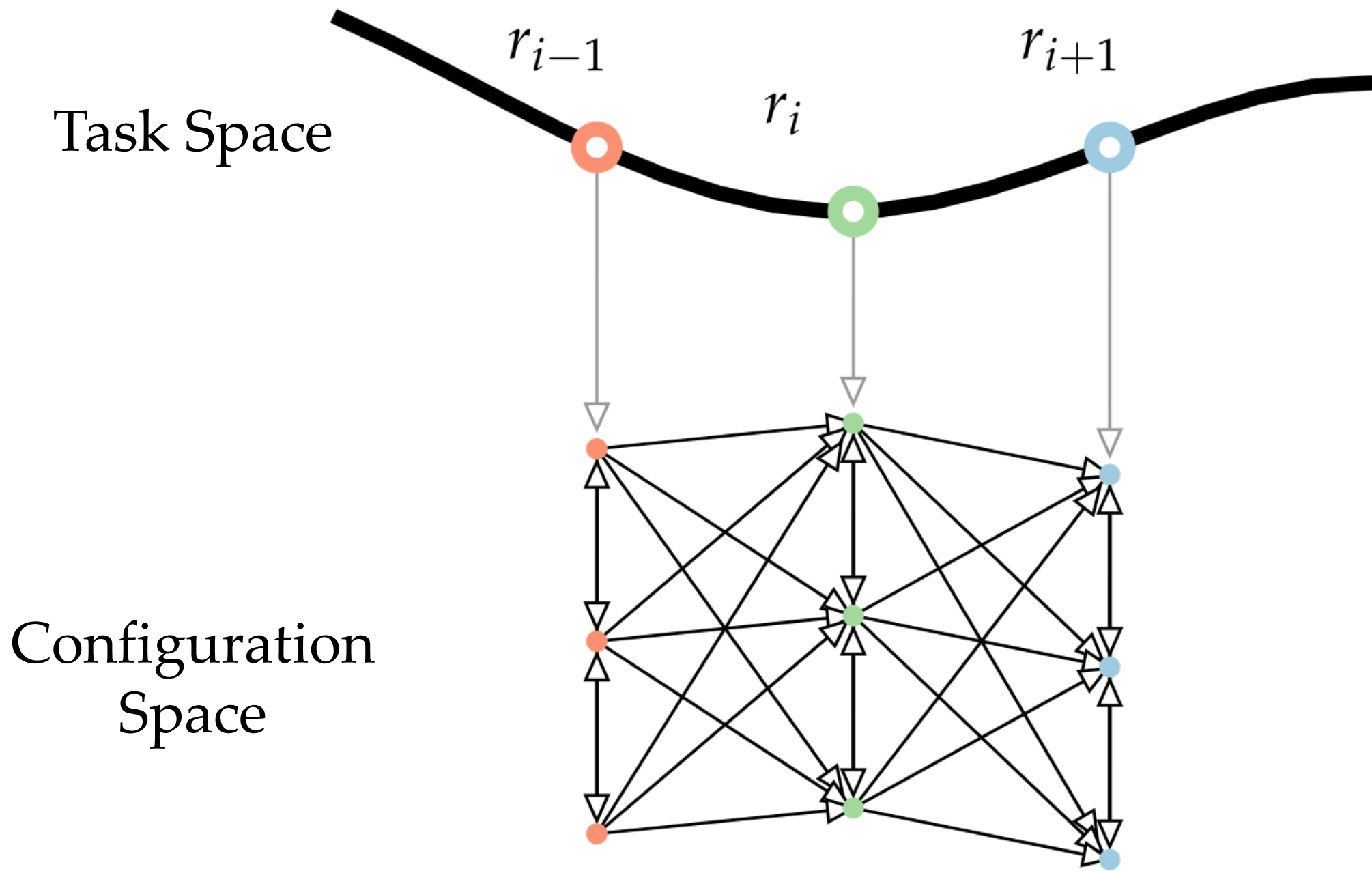


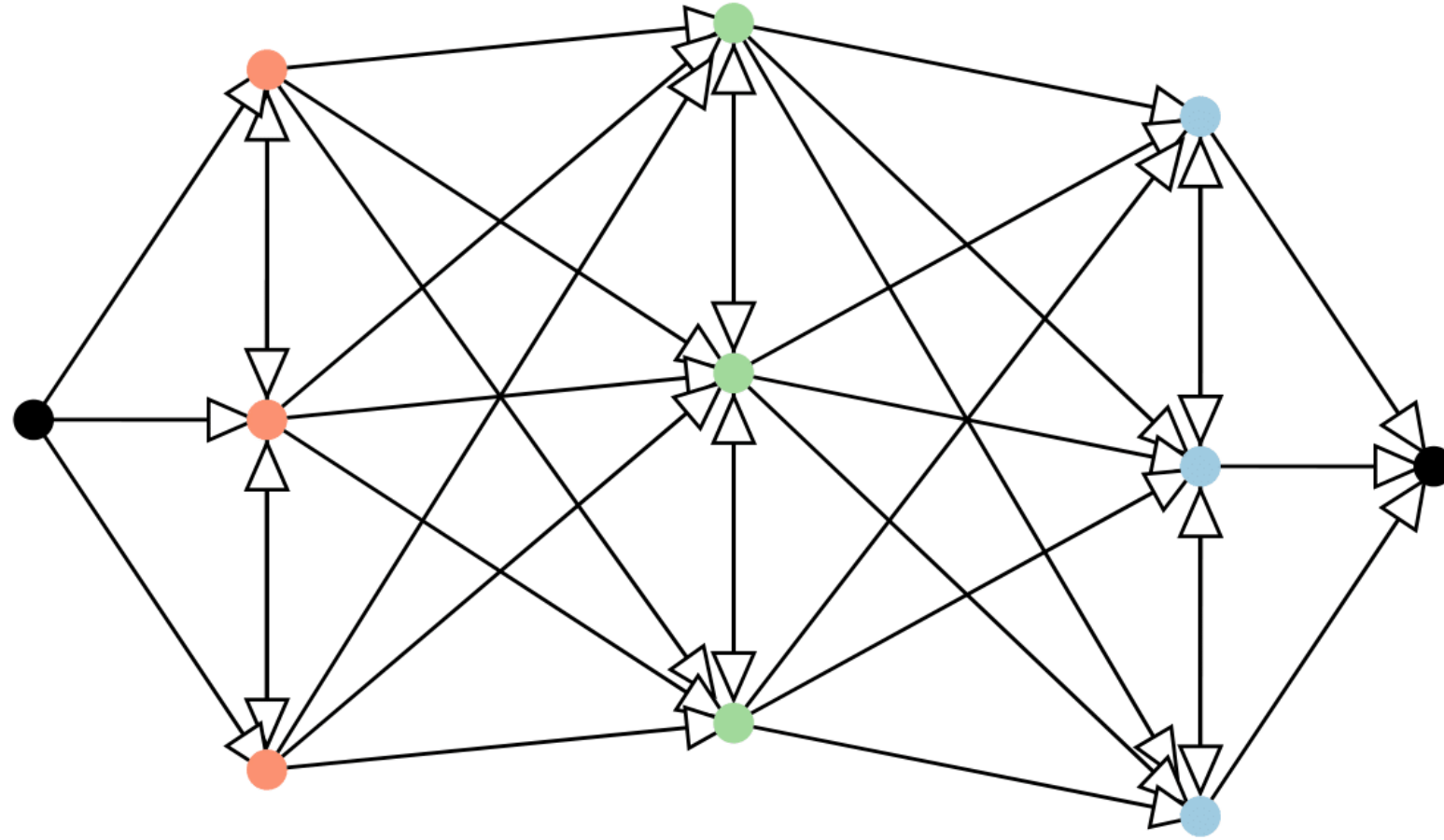


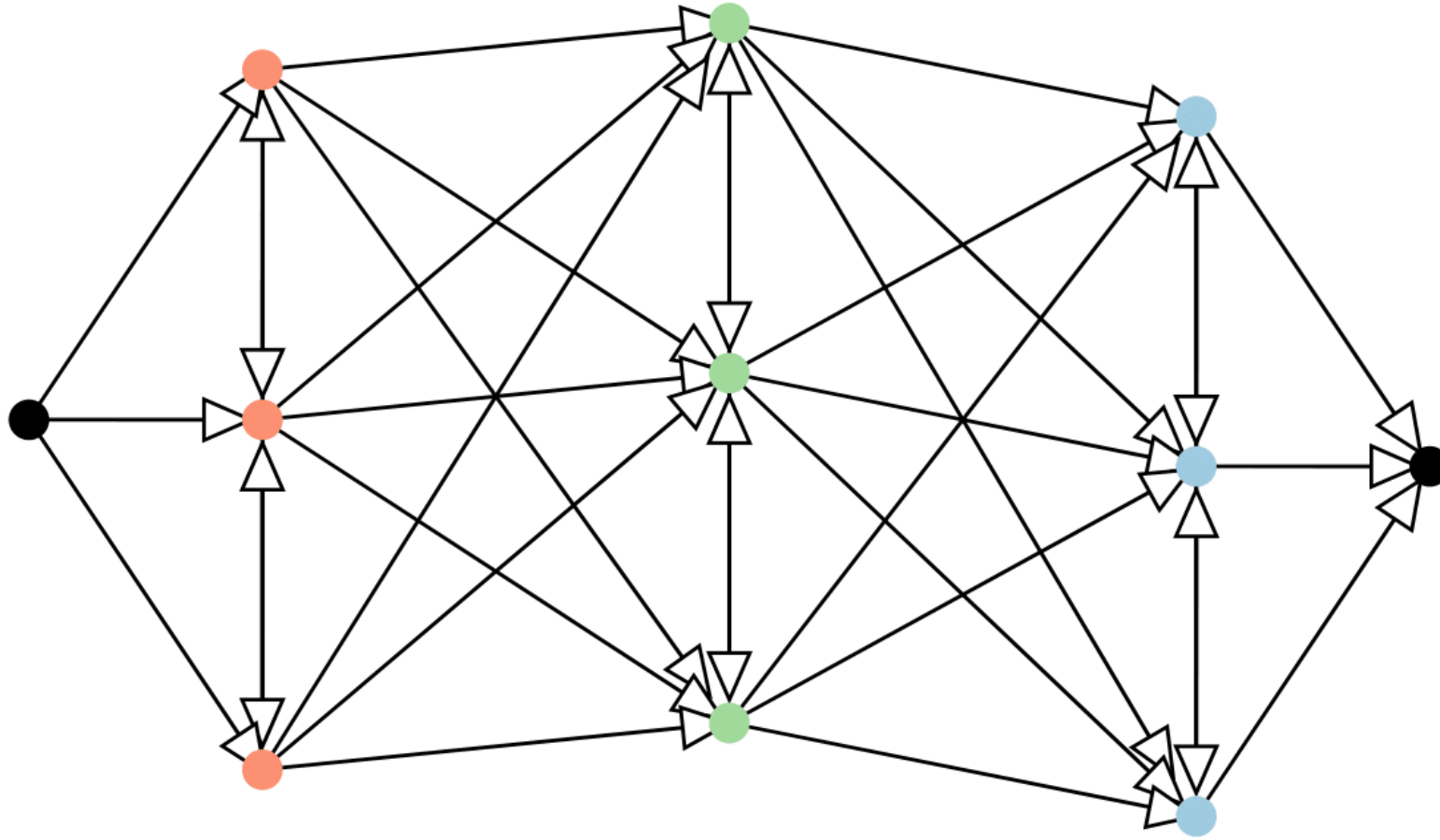




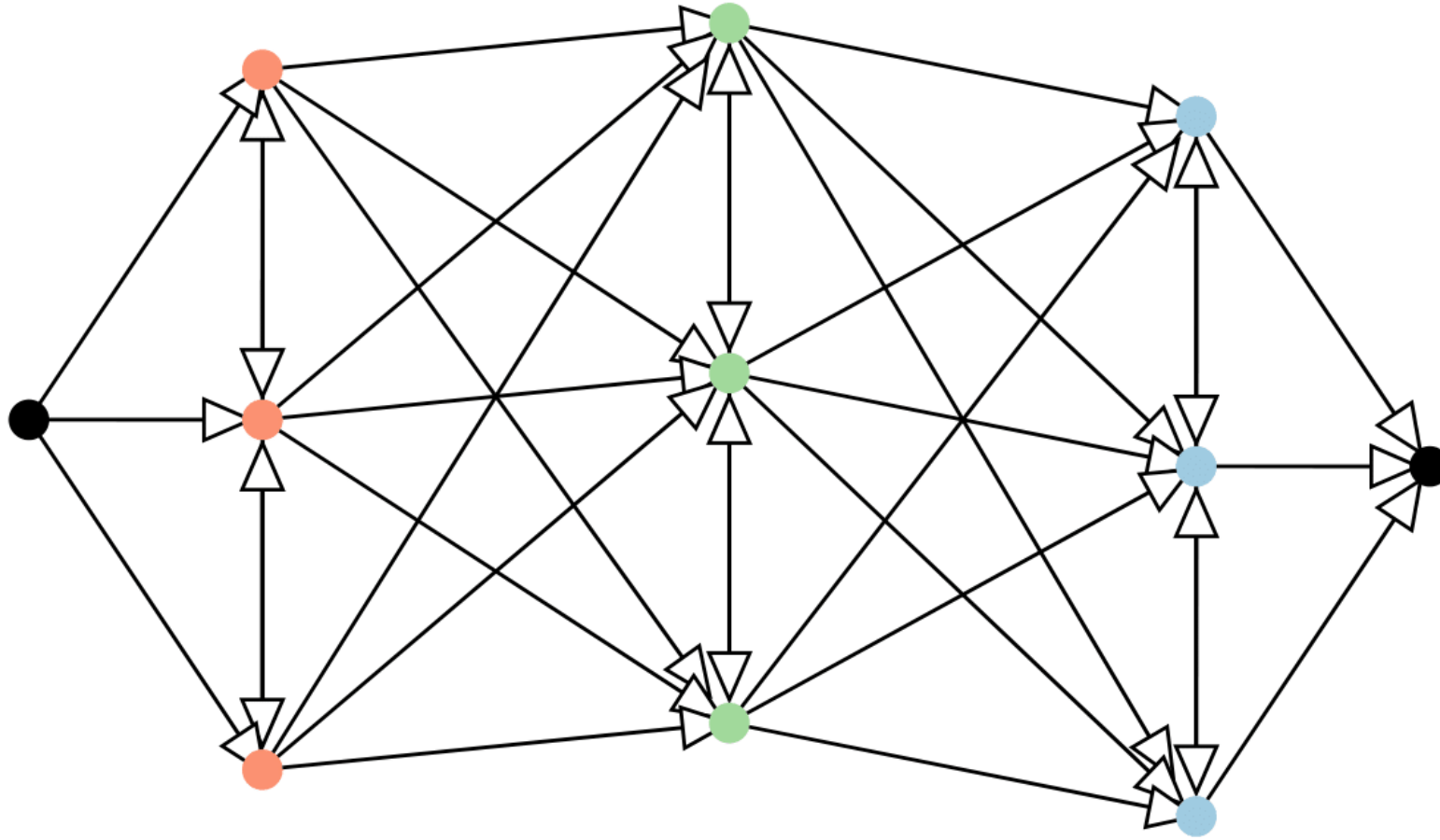






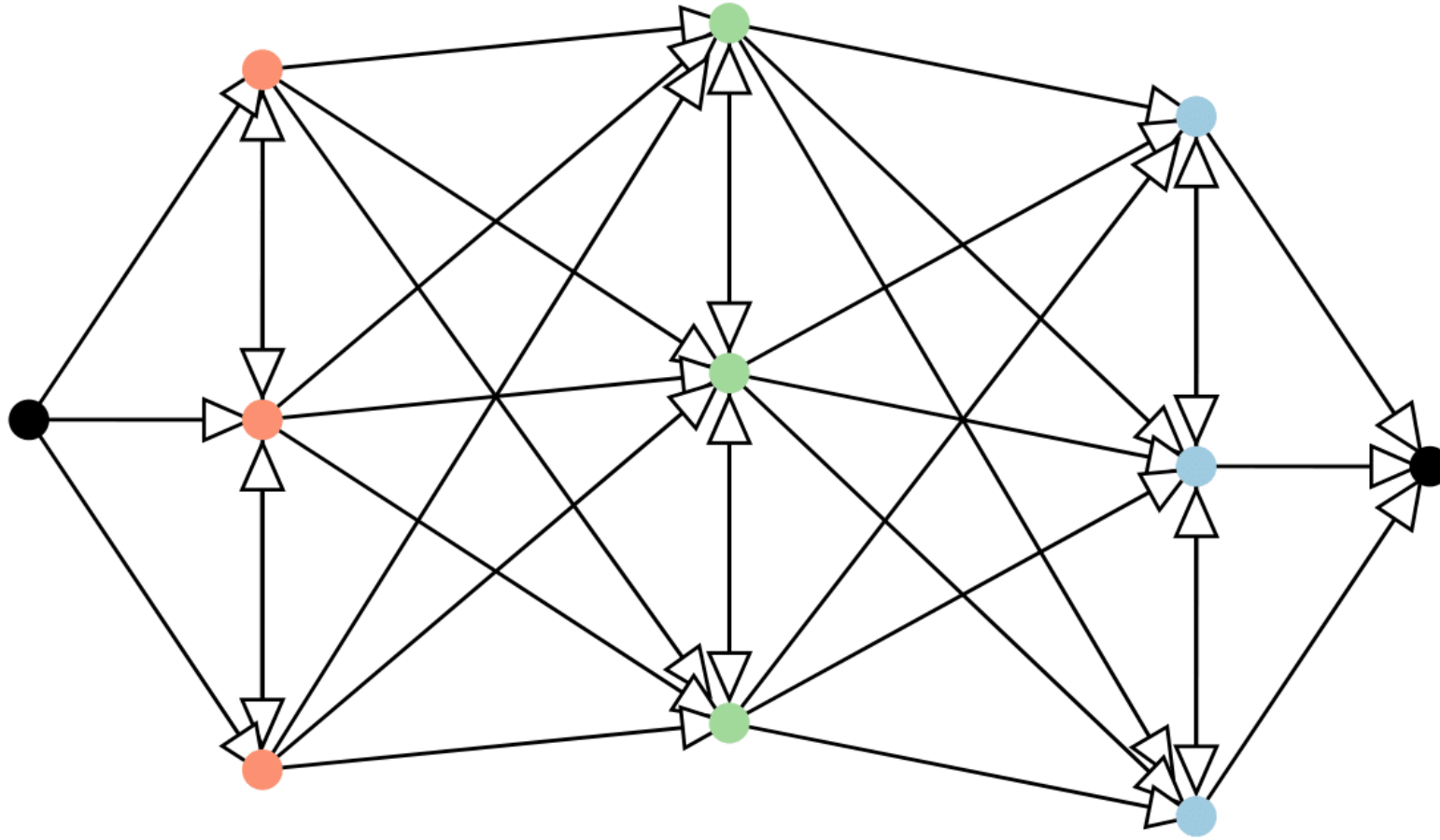


$$\xi^* = \arg \min_{p \in L} \text{Frechet}(FK(p), \bar{\xi})$$



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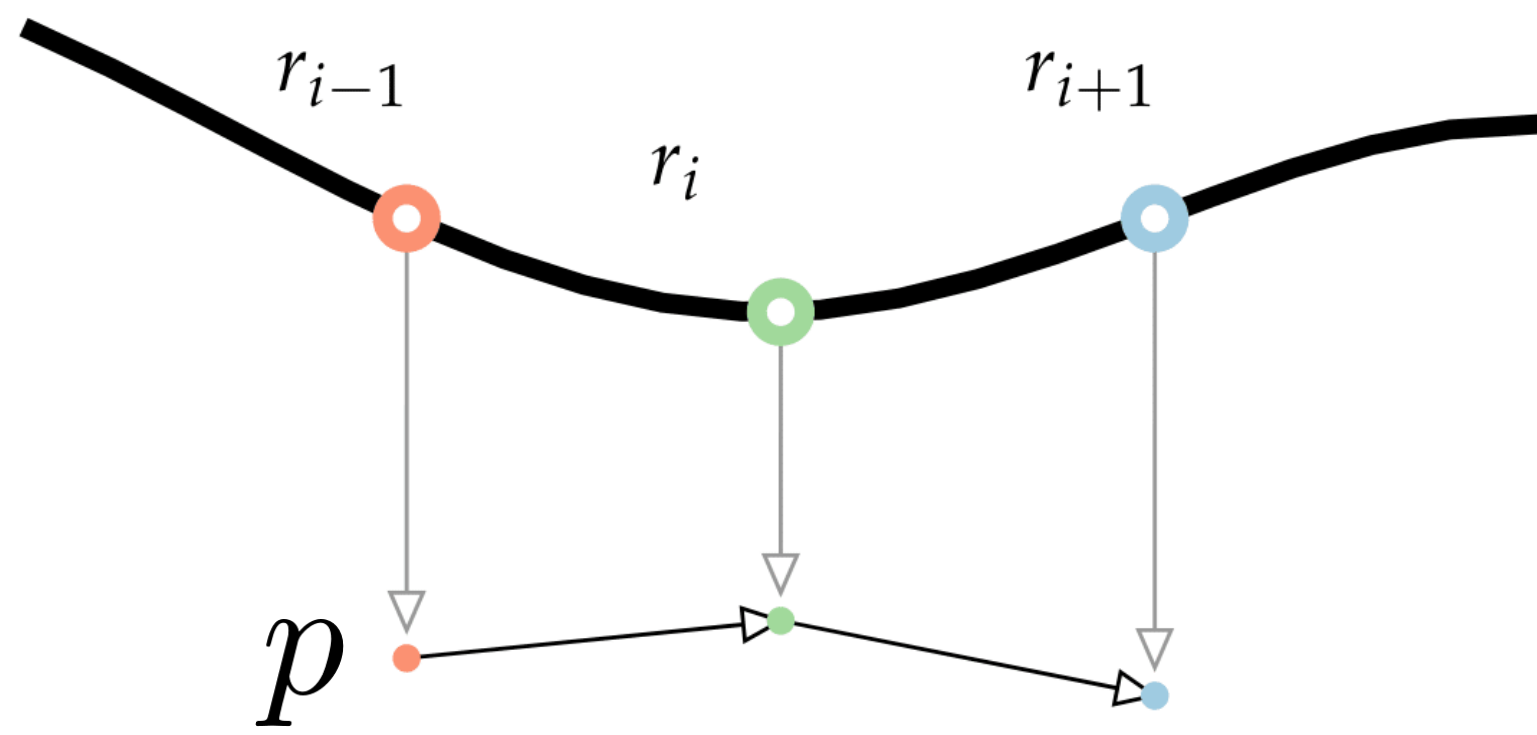
$$|p \in L|$$

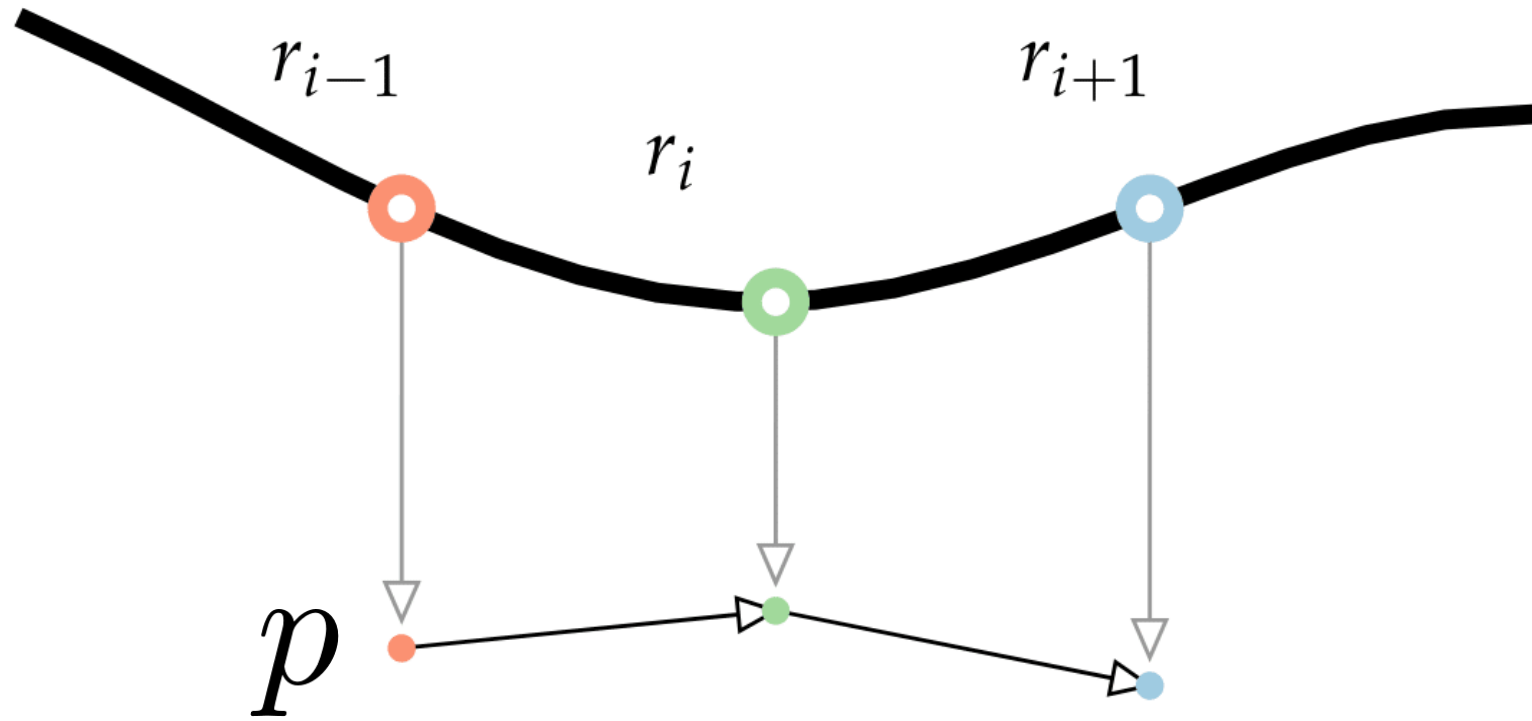


$$\xi^* = \arg \min_{p \in L} \text{Frechet}(FK(p), \bar{\xi})$$

$$|p \in L| \in \mathcal{O}(n^k)$$

Can we be more
intelligent in our search?





$$Frechet(FK(p), \bar{\xi})$$

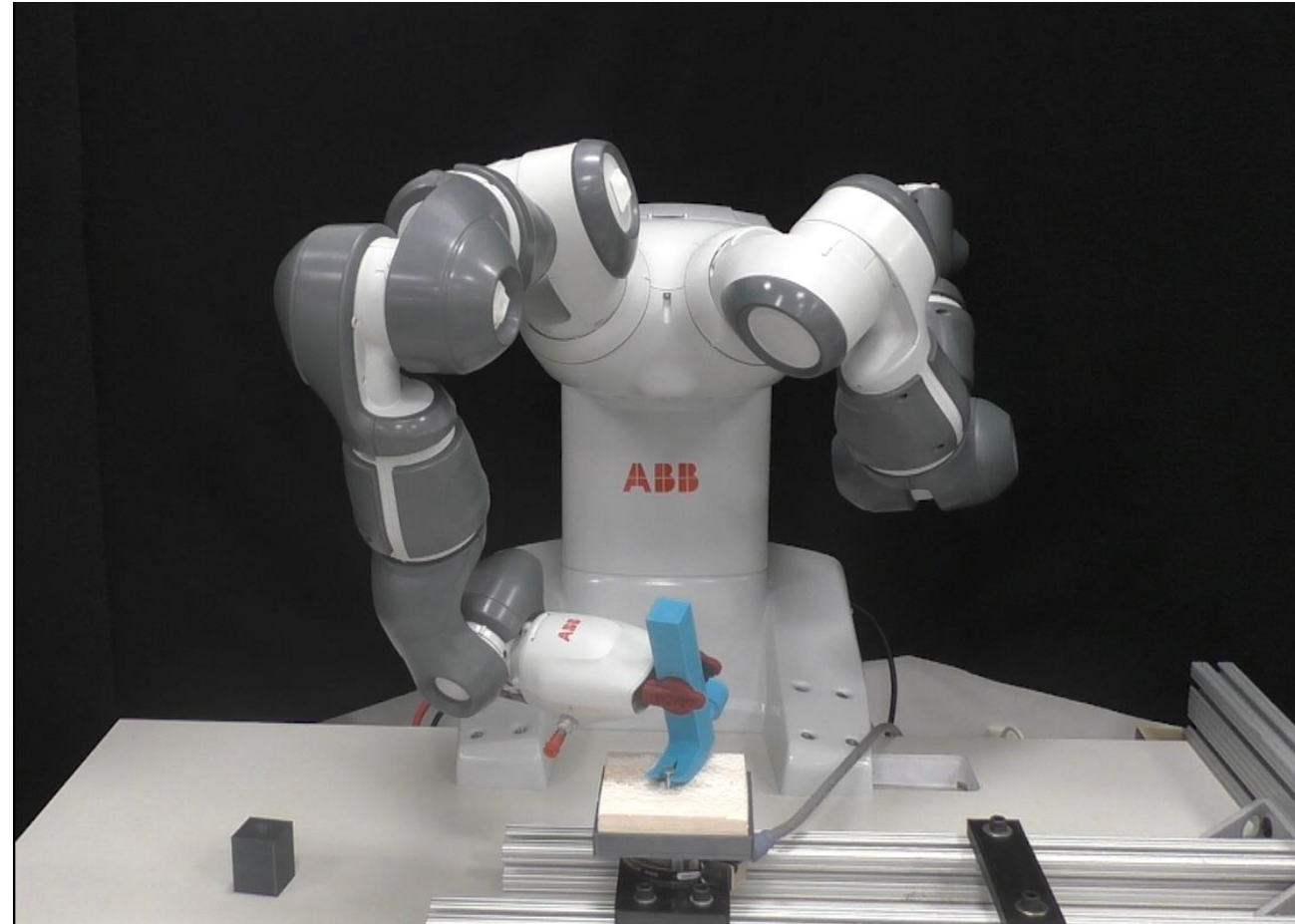
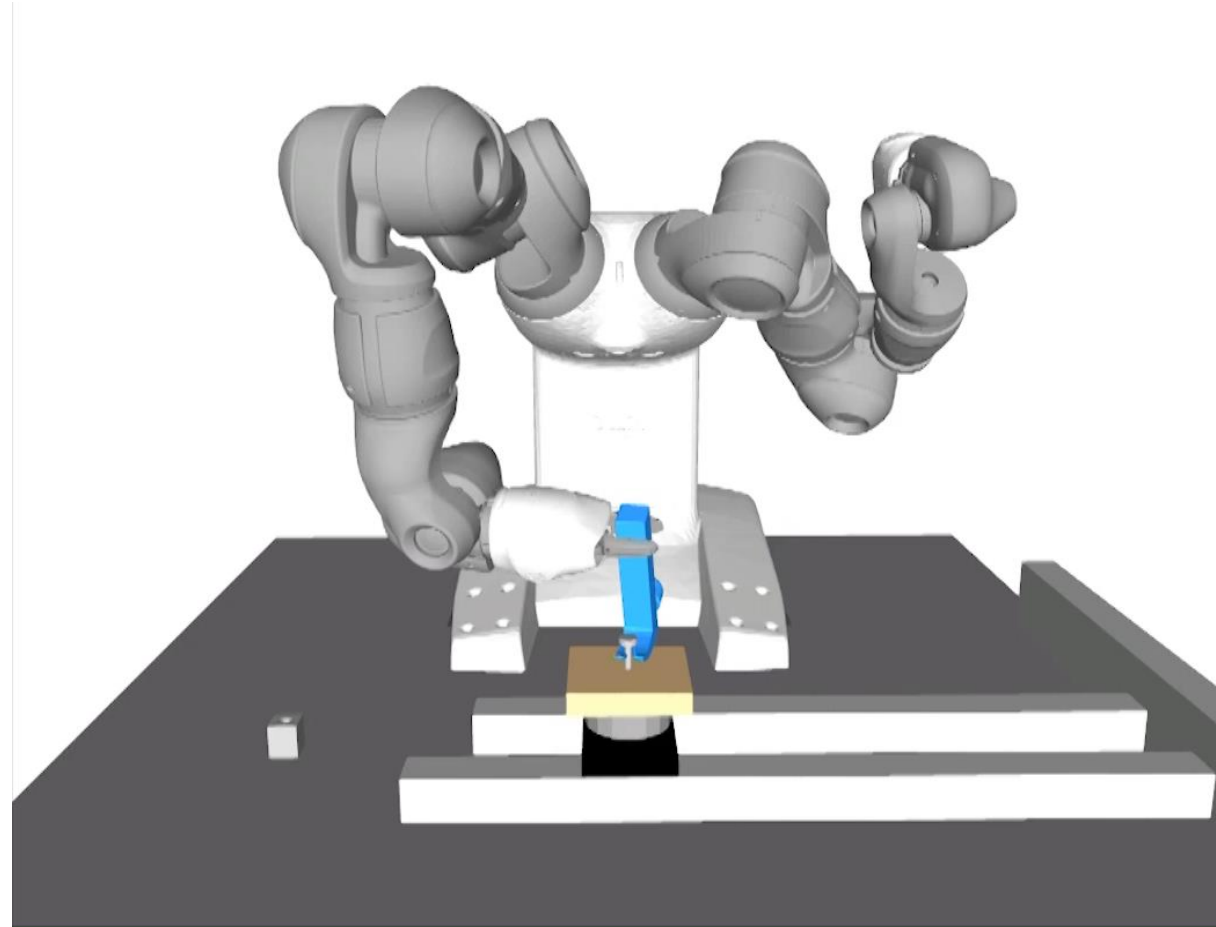
Search the Cross Product Space of
the two paths
to find the Minimum Leash.

Search the Cross Product Space of
the reference path and the graph
to find the Minimum Leash.

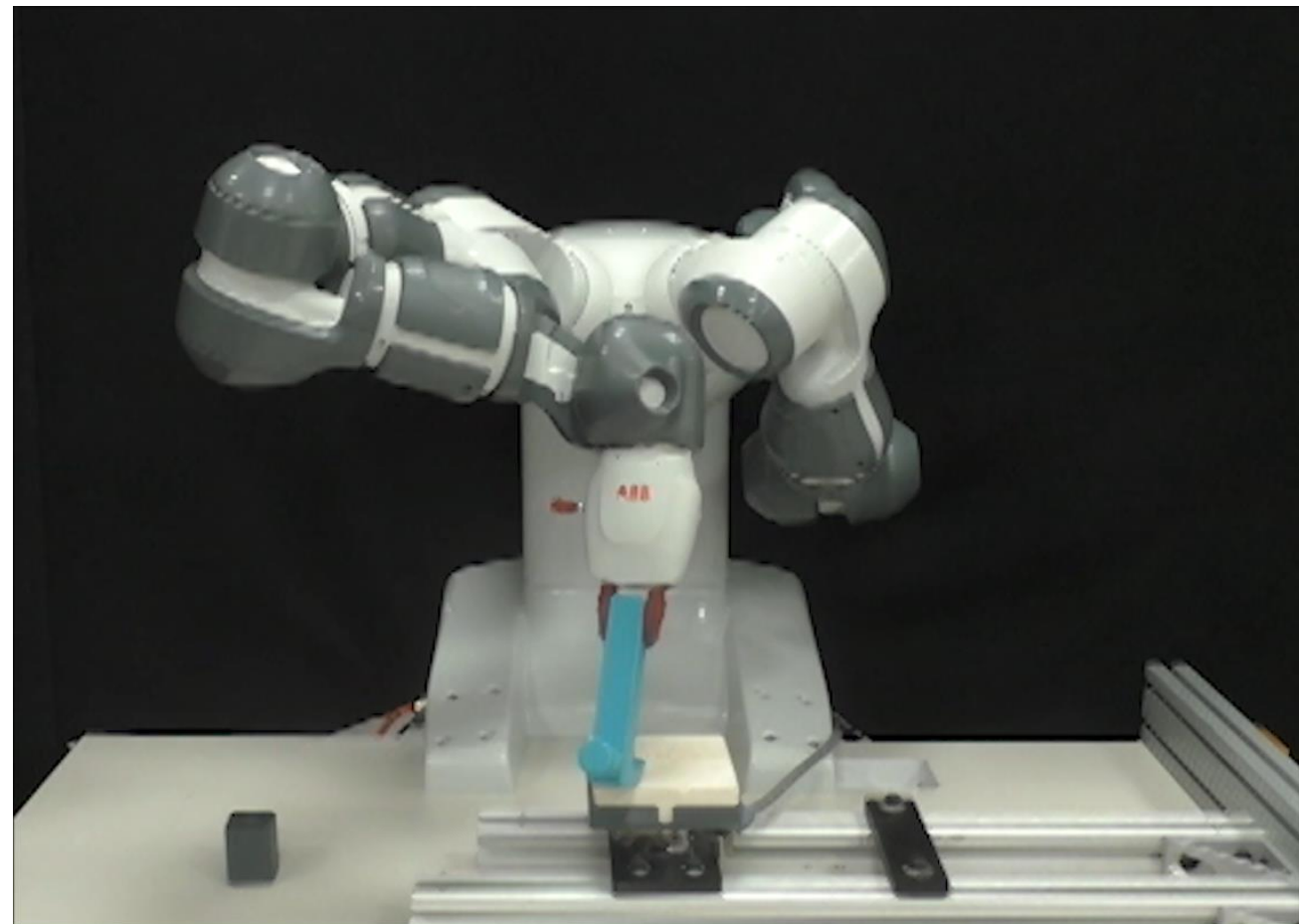
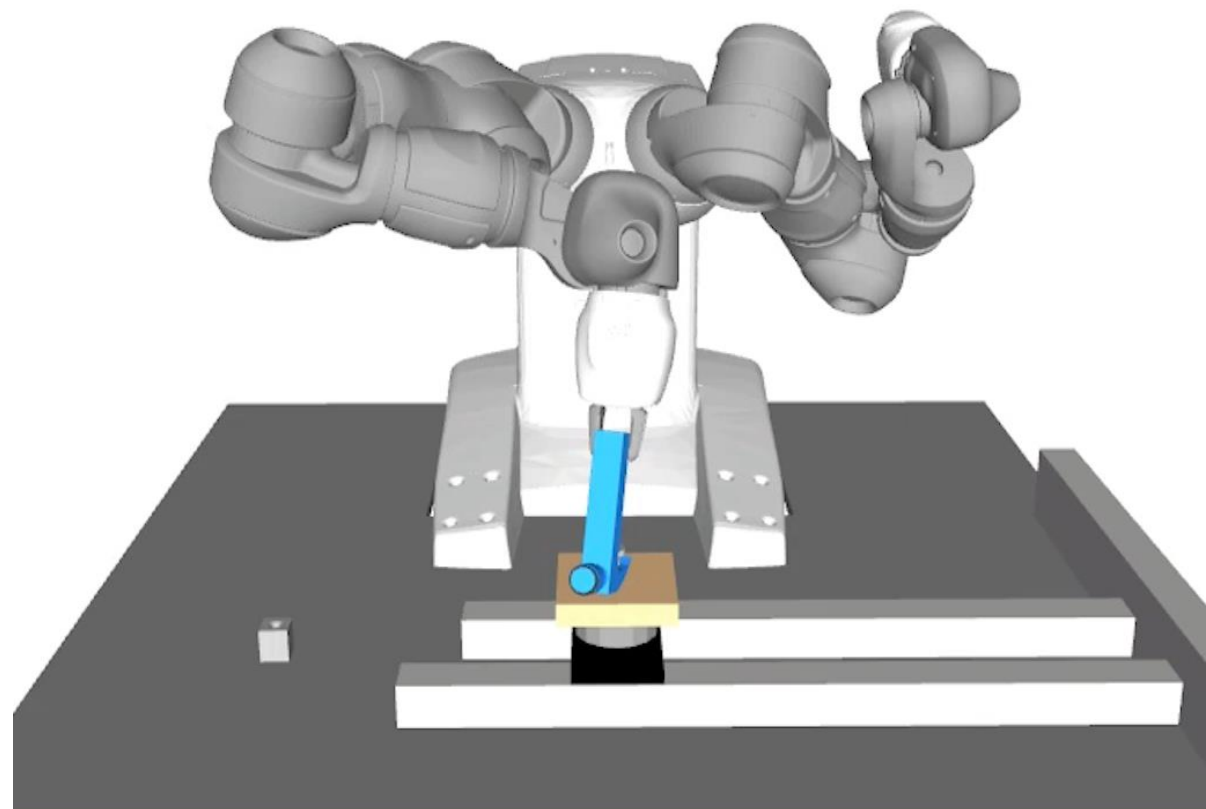
Search the Cross Product Space of
the reference path and the graph
to find the *Bottleneck Shortest Path*.

Back-Up Slides: Impact of Torque Constraint

What if we violate these constraints?



Torque Fault!



Success!