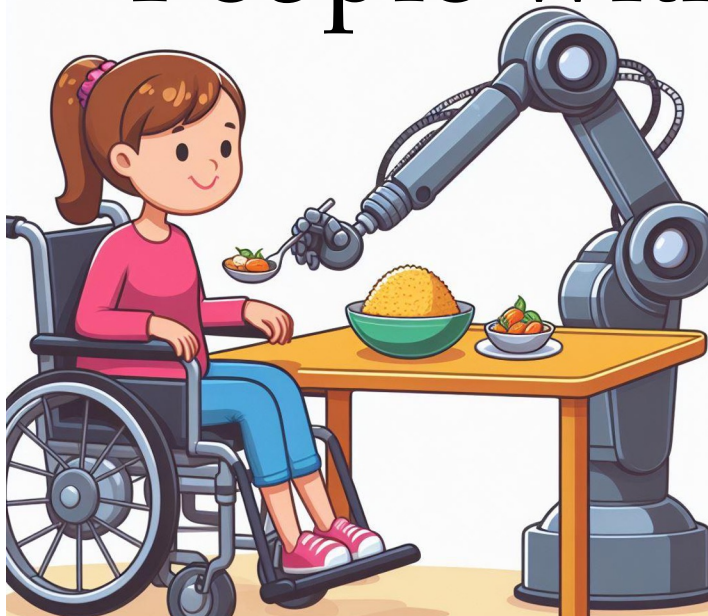


Achieving Deployable Autonomy in Robot-assisted Feeding for People with Motor Impairments



Amal Nanavati

General Exam, 12-08-2023
Joint work with Sidd and Maya



W
UNIVERSITY of
WASHINGTON

Think about a recent **enjoyable meal experience**.

What made it **meaningful?**





“Sometimes I wait little longer to ask [my caregiver] for a bite or a drink because it might mess up a conversation. It's definitely something that's always in the back of my mind while eating socially... Sometimes I find that I'm not eating or barely eating at all because I'm a little self-conscious of interrupting a conversation.” (P2)



**1.8 million
Americans need
assistance eating***



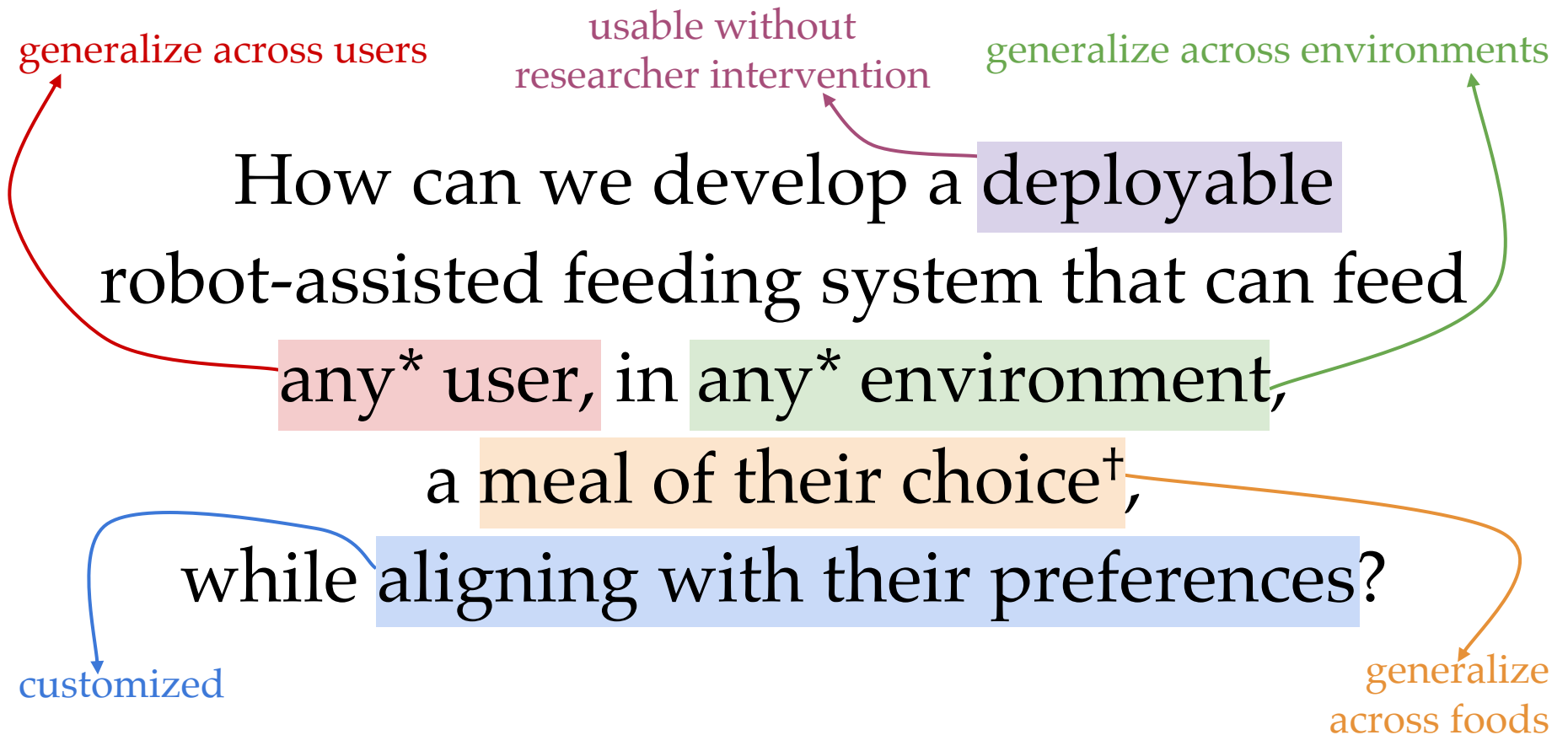
1x

* as of 2010

Theis, Kristina A., et al. "Which one? What kind? How many? Types, causes, and prevalence of disability among US adults." *Disability and health journal*. (2019)

Deployable Robot-assisted Feeding (RAF)



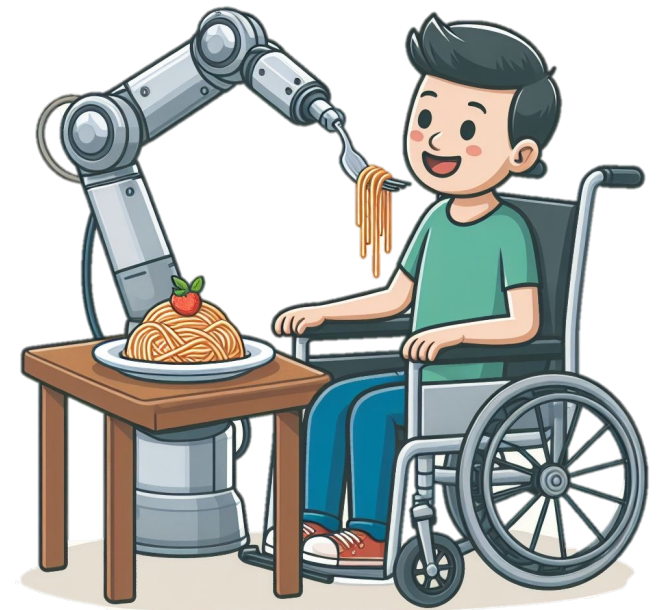


* “any” = North Star.
Demonstrate it with “multiple”

[†] that can be acquired with
a single arm using a fork

Roadmap

1. Motivation
2. Robot-assisted Feeding Overview
3. RQ1: Users' Needs Assessment [Completed]
4. RQ2: Generalizing Bite Acquisition [Completed]
5. RQ3: Developing a Deployable System [Ongoing]
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Self-feeding has been a research goal since the 1970s

Commercial

Research

1970s

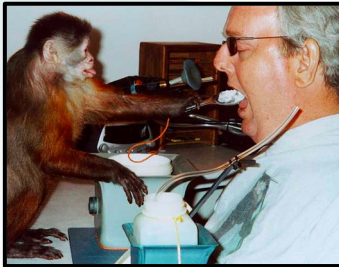
1980s

1990s

2000s

2010s

2020s



monkey service animals, 1977

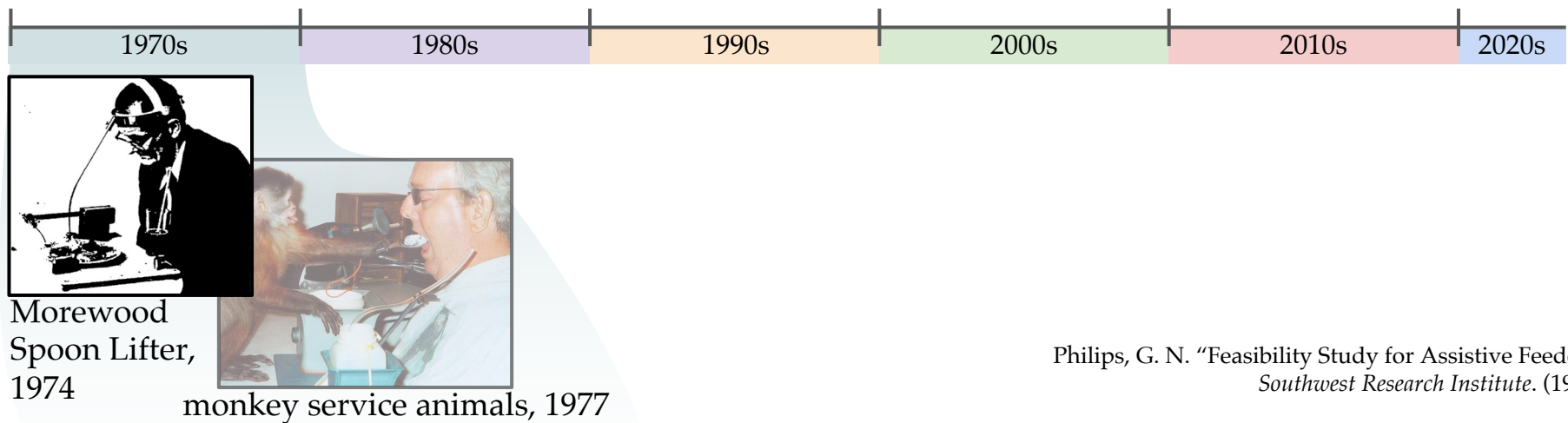
Hien, Emmanuelle, and Bertrand L. Deputte. "Influence of a capuchin monkey companion on the social life of a person with quadriplegia: an experimental study." *Anthrozoös*. (1997)

[Envisioning Access: Our Past](#)

Self-feeding has been a research goal since the 1970s

Commercial

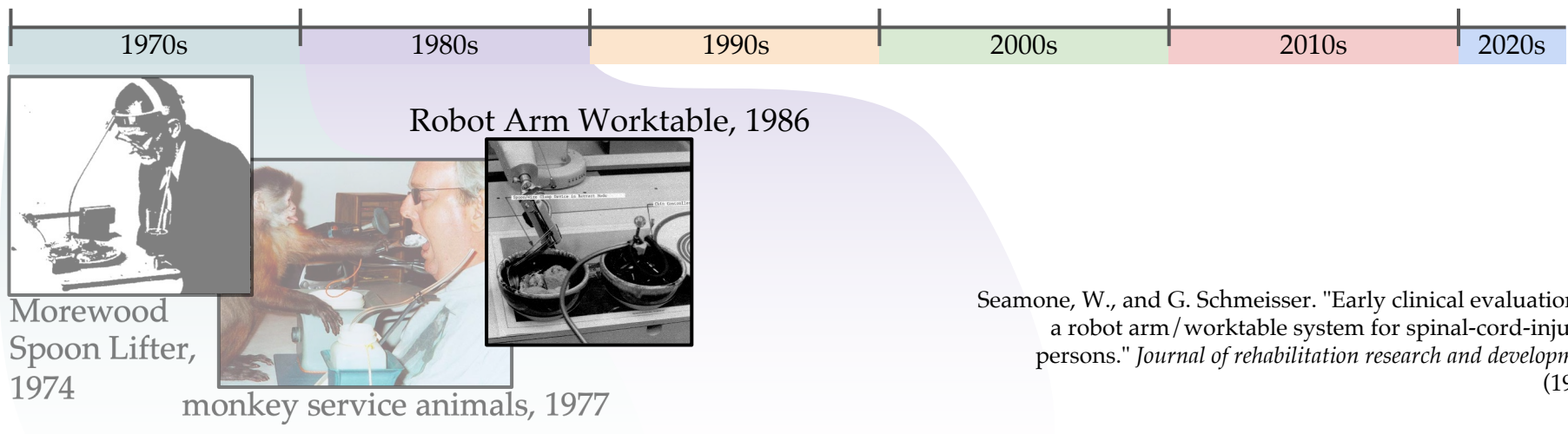
Research



Self-feeding has been a research goal since the 1970s

Commercial

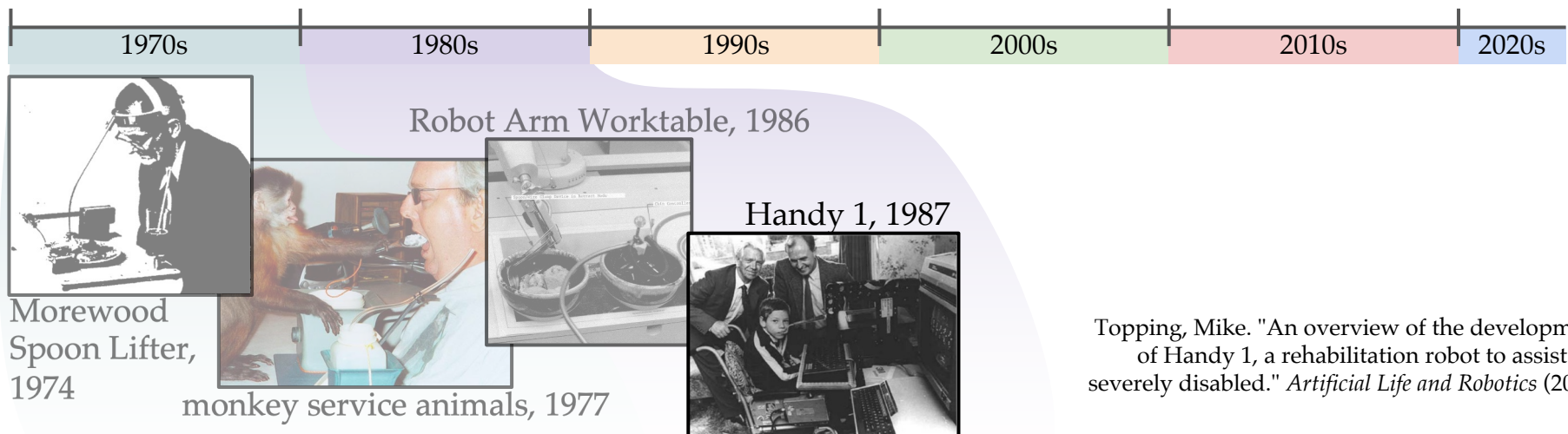
Research



Self-feeding has been a research goal since the 1970s

Commercial

Research



1970s-80s: Deployments & Clinical Evaluations

The staff reported that most individuals who were shown the original spoon lifter were negative towards gadgets and preferred to have someone feed them. However, one C₄ level quadriplegic subject was able to functionally feed himself a complete meal using the device. This subject requested permission to take the device home, and arrangements were made for him to do so. He continued to use it in the home situation for almost three years. This individual found it necessary to put Reston Foam under the front of the head band to relieve the pressure against his forehead and to help to keep the head band from slipping. The staff at this center made the initial suggestions that were incorporated in the modified feeder, and this subject's spoon lifter was modified. The staff also reported that the subject had to have good trunk balance in order to use the feeder and that the motor would stall if food was stuck to the bottom of the spoon.

Progress — Through December 1984, 20 male quadriplegics between 21 and 60 years of age at evaluation had been involved in the evaluation in three geographical areas, i.e., Baltimore-Washington, Richmond, and Cleveland. They ranged from five to 26 years between time of injury and evaluation. The levels of injury ranged from C-2 to C-5. Individual accumulations of time actually working with the equipment ranged from one hour to over 100 hours; 316 meals were eaten by these individuals using the Robot Arm. Among the nine quadriplegics who tested the equipment at the Richmond VAMC, seven indicated that they found the equipment gratifying to use, especially for self-feeding. Among the seven

Robot Arm Worktable (1980s):

- 20 people with quadriplegia
- Environments: family home, nursing home, hospital
- As long as 1 year of use

Morewood Spoon Lifter (1970s):

- 16 veterans with spinal cord injuries
- 3 year home deployment

Seamone, W., and G. Schmeisser. "Early clinical evaluation of a robot arm/worktable system for spinal-cord-injured persons." *Journal of rehabilitation research and development* (1985)

Philips, G. N. "Feasibility Study for Assistive Feeder". *Southwest Research Institute*. (1986)

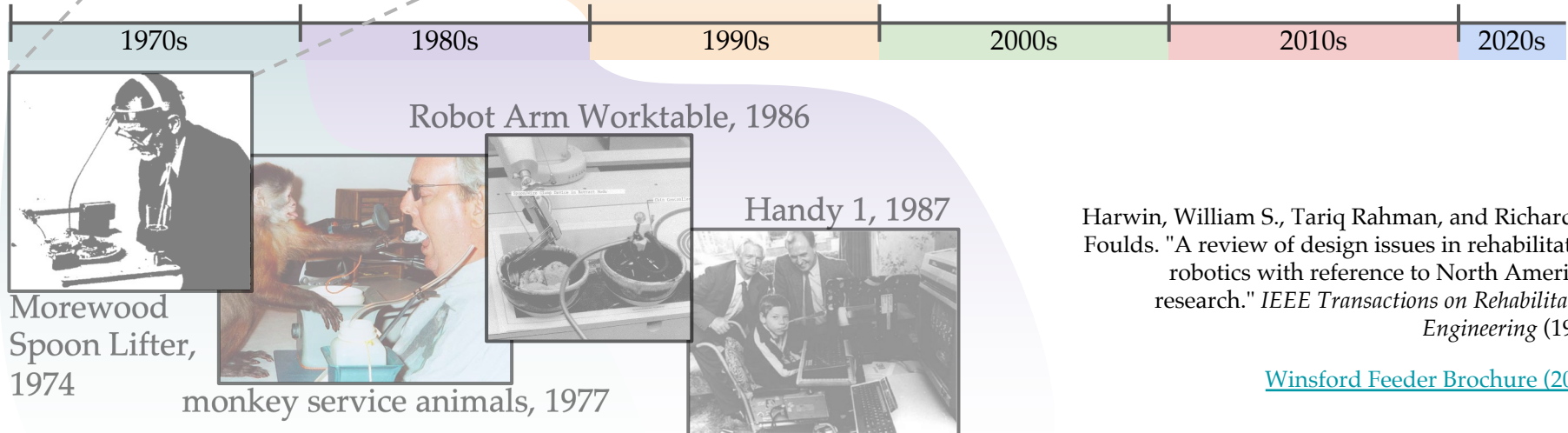
Commercial translation in 1990s-2000s

Commercial

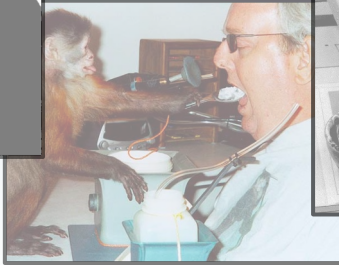
Winsford Feeder, 1990s



Research

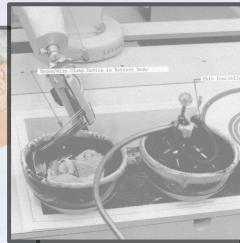


Morewood Spoon Lifter, 1974



monkey service animals, 1977

Robot Arm Worktable, 1986



Handy 1, 1987



Harwin, William S., Tariq Rahman, and Richard A. Foulds. "A review of design issues in rehabilitation robotics with reference to North American research." *IEEE Transactions on Rehabilitation Engineering* (1995)

[Winsford Feeder Brochure \(2011\)](#)

Commercial translation in 1990s-2000s

Commercial

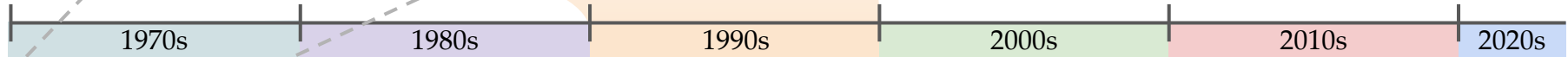
Winsford Feeder, 1990s



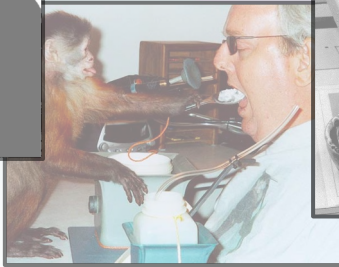
Neater Eater, 1990s



Research

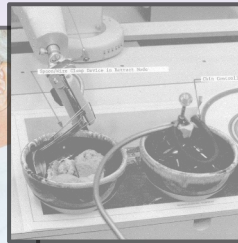


Morewood Spoon Lifter, 1974



monkey service animals, 1977

Robot Arm Worktable, 1986



Handy 1, 1987



Michaelis, J. "Mechanical methods of controlling ataxia." *Bailliere's Clinical Neurology* (1993)

[Neater Eater](#)

Commercial translation in 1990s-2000s

Commercial

Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



Research

1970s

1980s

1990s

2000s

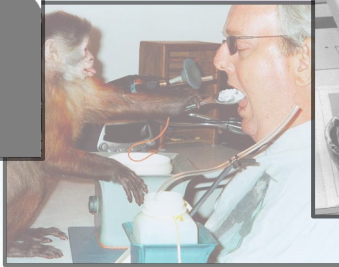
2010s

2020s

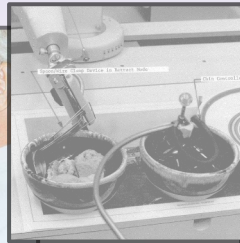


Morewood Spoon Lifter, 1974

Robot Arm Worktable, 1986



monkey service animals, 1977



Handy 1, 1987



Lindborg, Ann-Louise, and Maria Lindén. "Development of an Eating Aid—From the User Needs to a Product." *pHealth* (2015)

[Bestic AB \(Youtube\)](#)

Commercial translation in 1990s-2000s

Commercial

Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



Obi, 2009



Research

1970s

1980s

1990s

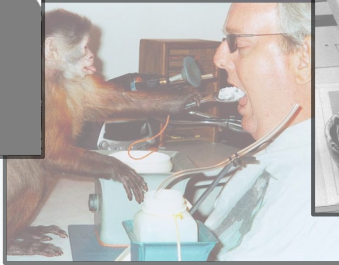
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2010s

2020s

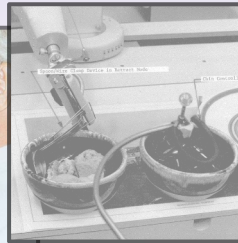


Morewood Spoon Lifter, 1974



monkey service animals, 1977

Robot Arm Worktable, 1986



Handy 1, 1987



Artman, Dar, et al. "[New Obi Robotic Dining Device a Breakthrough for People Living with Physical Challenges.](#)" (2016)

[MeetObi](#)

1990s-2000s: Is Robot-Assisted Feeding Solved?

- **Strengths** of Commercial Systems*:
 - Independently eating a full meal
 - Increased feelings of confidence
 - Improved posture
- **Shortcomings** of Commercial Systems*:
 - Only able to acquire limited foods
 - Acquiring too little food
 - Dropping food
 - Requiring users to hold head in stationary position
- All but Obi and Neater Eater have been discontinued 😞



* citations in General exam document

Modern Robot-assisted Feeding Research, 2010s-

Commercial

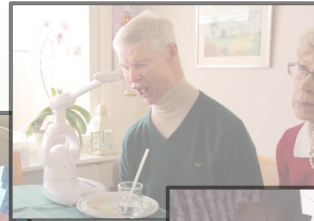
Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



Obi, 2009



Herlant, Laura V.
"Algorithms, implementation,
and studies on eating with a
shared control robot arm".
(2016)

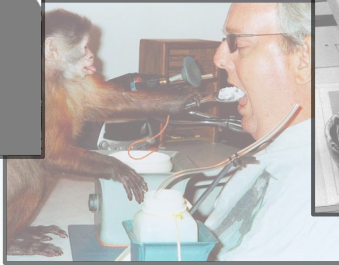
Research

1970s



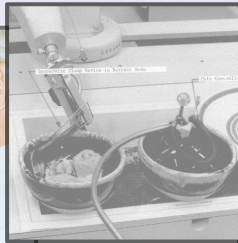
Morewood
Spoon Lifter,
1974

1980s



monkey service animals, 1977

Robot Arm Worktable, 1986



1990s



Handy 1, 1987

2000s

Personal Robotics Lab, 2010s



2010s

2020s

Modern Robot-assisted Feeding Research, 2010s-

Commercial

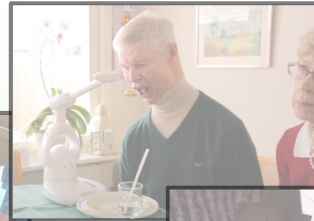
Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



Obi, 2009



Park, Daehyung, et al. "Active robot-assisted feeding with a general-purpose mobile manipulator: Design, evaluation, and lessons learned." *Robotics and Autonomous Systems* (2020)

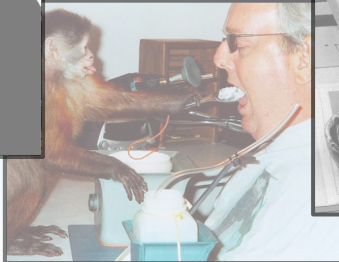
Research

1970s



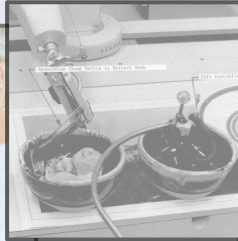
Morewood Spoon Lifter, 1974

1980s



monkey service animals, 1977

Robot Arm Worktable, 1986



1990s



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2000s



Personal Robotics Lab, 2010s

2010s



Kemp Lab, 2010s

2020s

Modern Robot-assisted Feeding Research, 2010s-

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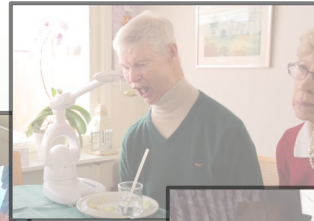
Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



Obi, 2009



Jenamani, Rajat et al. "Robot-assisted Inside-mouth Bite Transfer using Robust Mouth Perception and Physical Interaction-Aware Control". (2024)

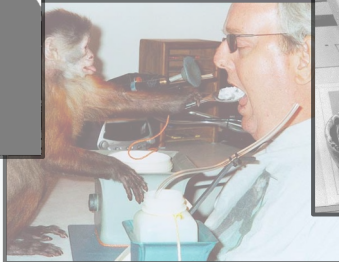
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1970s



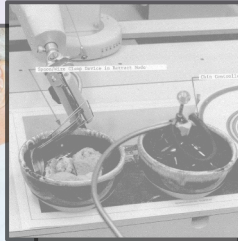
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1980s



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2000s



Personal Robotics Lab, 2010s

2010s



EmP RISE, 2021

2020s



Kemp Lab, 2010s

Modern Robot-assisted Feeding Research, 2010s-

Commercial

Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



Obi, 2009



Nguyễn, Vy. "Increasing Independence with Stretch: A Mobile Robot Enabling Functional Performance in Daily Activities". (2021)

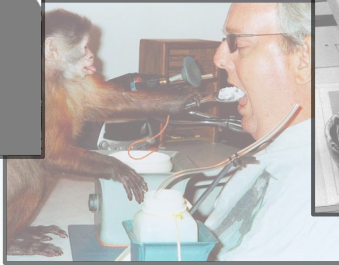
Research

1970s



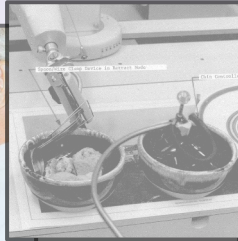
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1980s



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Handy 1, 1987



2000s

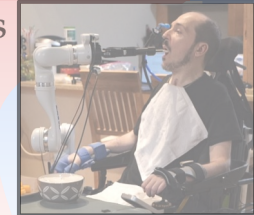


Personal Robotics Lab, 2010s



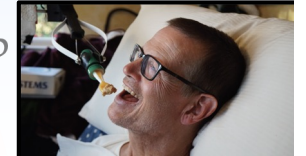
Kemp Lab, 2010s

2010s



EmP RISE, 2021

Hello Robot, 2021



2020s

Modern Robot-assisted Feeding Research, 2010s-

Commercial

Winsford Feeder, 1990s



Neater Eater, 1990s



Bestic, 2004



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Research

1970s



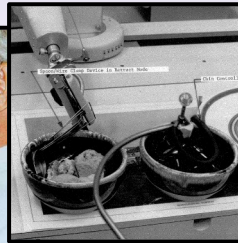
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1990s

Handy 1, 1987

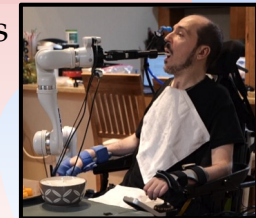


2000s

Personal Robotics Lab, 2010s



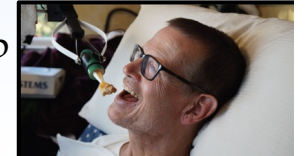
2010s



EmP RISE, 2021

2020s

Hello Robot, 2021



Kemp Lab, 2010s



Our Robot-Assisted Feeding System

Bite Acquisition



Bite Transfer



Community-Based Participatory Research (CBPR)



Tyler Schrenk

- Entire research process is grounded in and accountable to community needs and priorities
- **Community Researchers:** equal team members throughout the process, from ideation to dissemination
- Academic & community researchers each bring unique skills, expertise, and **lived experience** to the table
- Learn from each other
- Long-term partnership

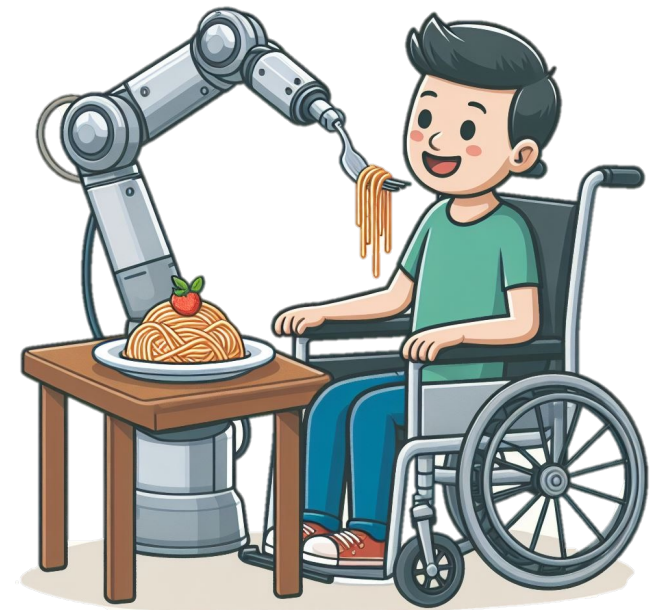
Israel, B. A., Schulz, A. J., Parker, E. A., & Becker, A. B. "Review of community-based research: assessing partnership approaches to improve public health". *Annual review of public health*. (1998)



Jonathan Ko

Roadmap

1. Motivation
2. Robot-assisted Feeding Overview
3. RQ1: Users' Needs Assessment [Completed]
4. RQ2: Generalizing Bite Acquisition [Completed]
5. RQ3: Developing a Deployable System [Ongoing]
6. RQ4: Customizing to Users and Environments [Proposed]
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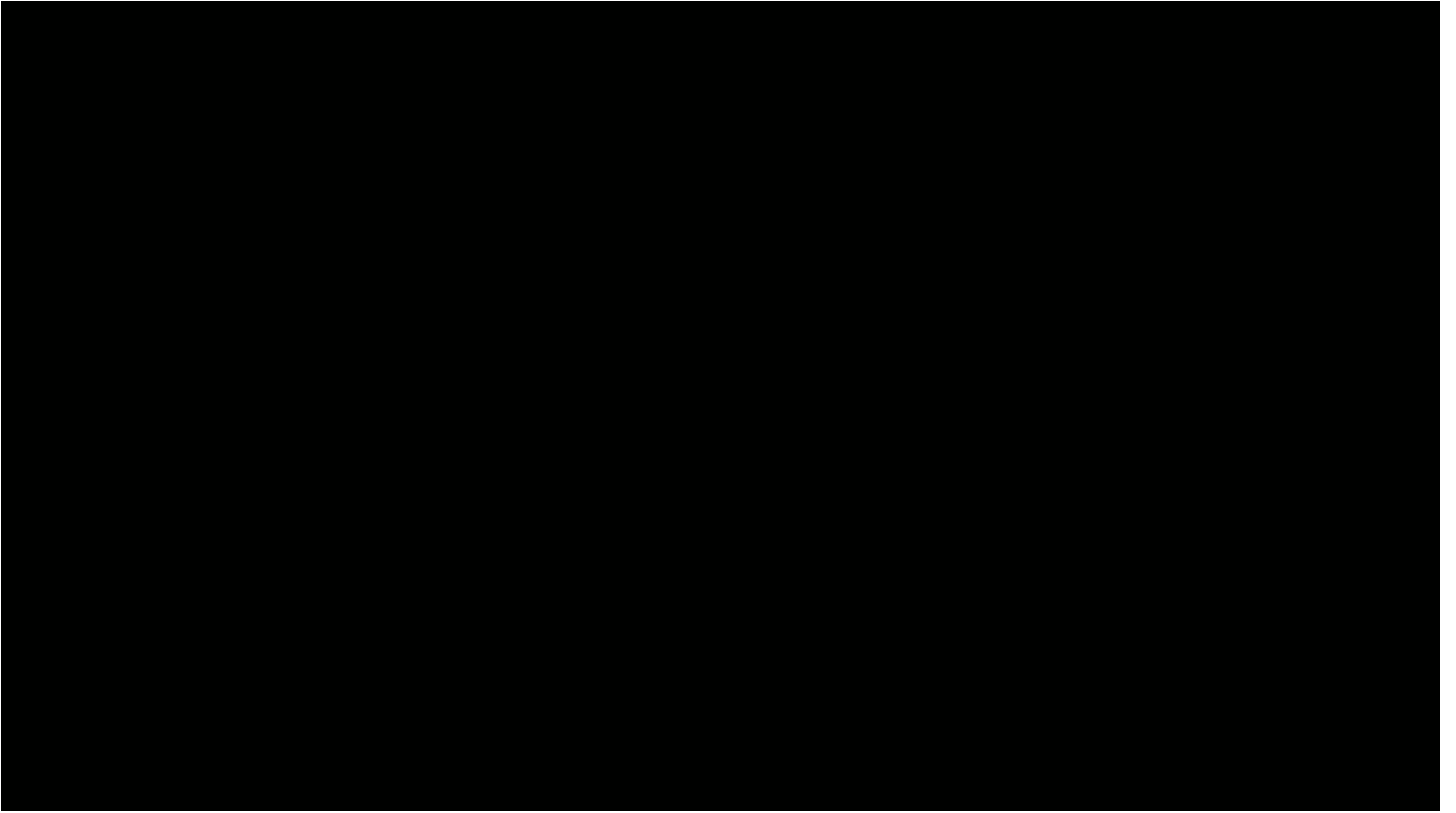


RQ1: What challenges do users face during (social) dining, and how can a robot-assisted feeding system address them?

Method

- Remote, semi-structured interviews led by community researcher
- n=10 participants
- Study stages:
 - Discuss current dining routines
 - Watch social dining videos showcasing various robot features
 - Discuss participants' thoughts
- Thematically analyzed participant quotes





CHALLENGES OF CURRENT SOCIAL DINING

SELF-CONSCIOUSNESS

A. "There are sometimes people who are not used to seeing the situation, they **stare and make you feel uncomfortable.**" (P4)

B. "I end up doing the open mouth [cue] with caretakers... Which **I don't love doing** if I'm out at a restaurant, just **sitting there with my mouth open.**" (P9)

C. "Nobody can feed me better than my parents. So if I want to eat with others, I for sure need one of them. And sometimes **you can't really go with parents to some events.**" (P10)

D. "I'd have to tell [my caregiver] how to do things. 'Not that much', 'Little more', personal cues and directions. **It would just take up all the conversation.**" (P1)

PRESSURE

E. "If a caregiver's holding a fork in front of my face... **I feel like it's pressuring...** [I need to] rush to chew and then take the next bite." (P9)

F. "If I want to eat to the point where I don't feel hungry, it would take 4 times longer than them. I don't want that to happen, so I need to eat less, and **when I get back home I need to eat again.**" (P10)

BURDEN

G. "I feel like **the other person doesn't eat comfortably** because they have to be feeding me and then they have to take a bite." (P2)

H. "When I'm around friends, sometimes I feel a bit bad. I have to keep [saying], 'mom, can I have a bite of my food?' **It's a distraction to get someone to remember me.**" (P9)

Caregiver Variability

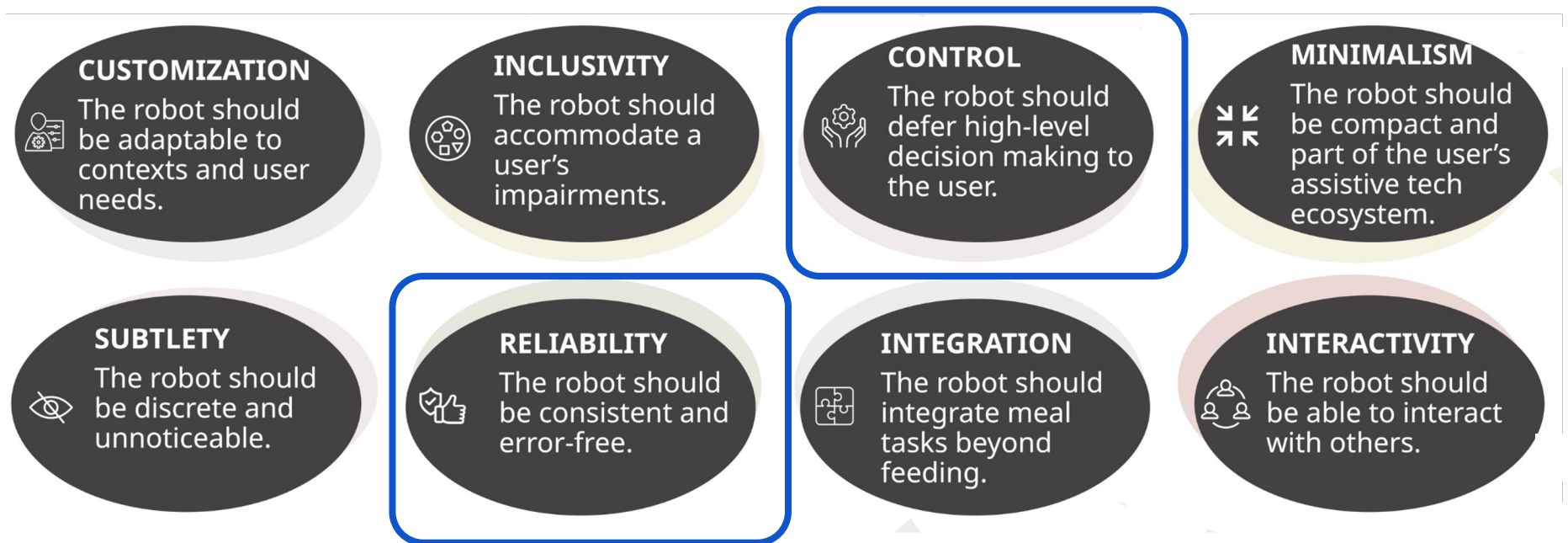
Caregivers feed differently (e.g., bite size, eating pace, etc.)

Participants feel self-conscious about interrupting a conversation to instruct their caregiver

Participants don't feel comfortable bringing some caregivers to some social interactions.

Participants want
consistent customization

Design Principles



Nanavati, Amal*, Alves-Oliveira, Patrícia*, et al. "Design principles for robot-assisted feeding in social contexts." *HRI*. (2023)

Design Principles: Reliability

A.

"If it can't get it on the first try, it's still on the plate, **[the food's] not on me**. If it drops it on the way that would be worse." (P1)

B.

"If it was at a soccer game where [my wife] was sitting next to me, the side-resting position could **be in her way, in front of her face**." (P8)

C.

"I want everyone to just see me, not **see me behind a feeding device**." (P9)

RELIABILITY



The robot should be consistent and error-free.

Design Principles: Control

D.

"When it's something as delicate as 'if this messes up I can get impaled,' it would be good to have a **backup safety mechanism.**" (P8)

F.

"For me, I don't mind the robot doing a lot of the thinking, with the exception of **selecting what food I eat.**" (CR)

E.

"I'm not too fond of [automatic bite initiation]. It's restrictive. By giving the robot the command, **you are controlling the robot.**" (P6)

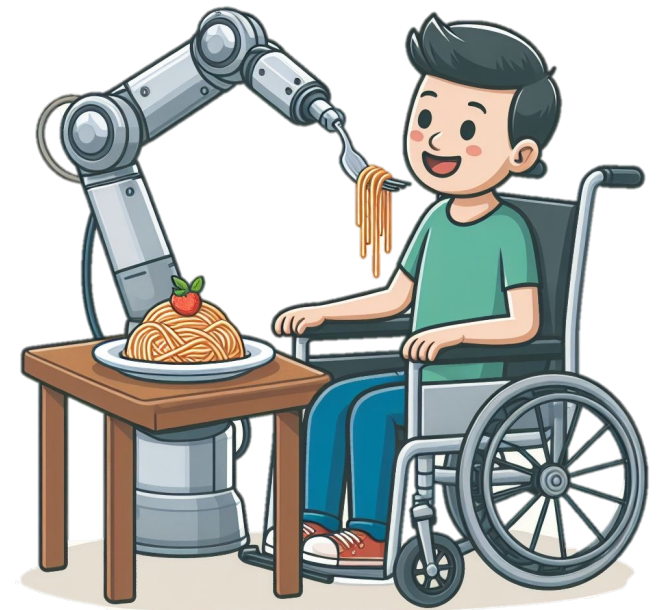
CONTROL

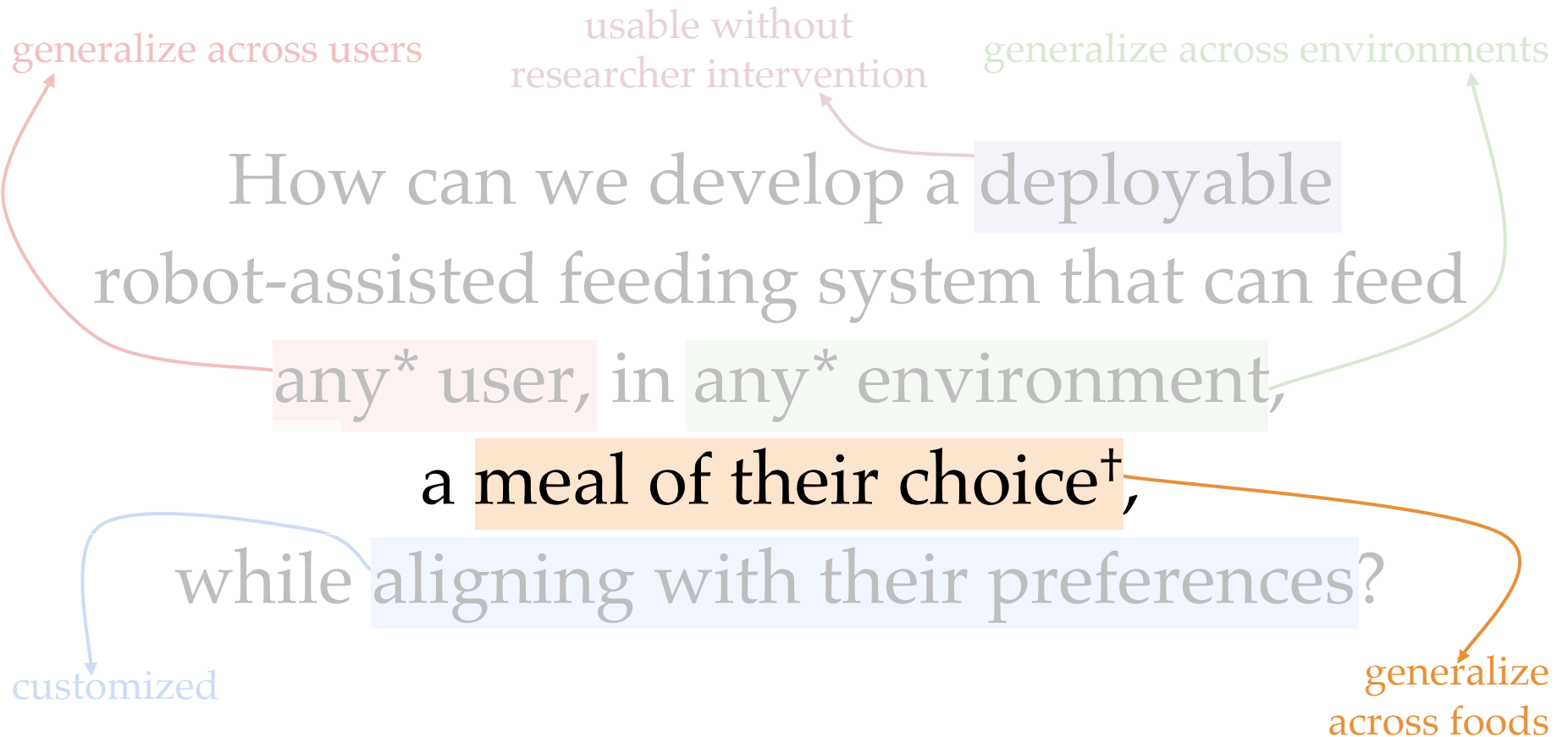


The robot should defer high-level decision making to the user.

Roadmap

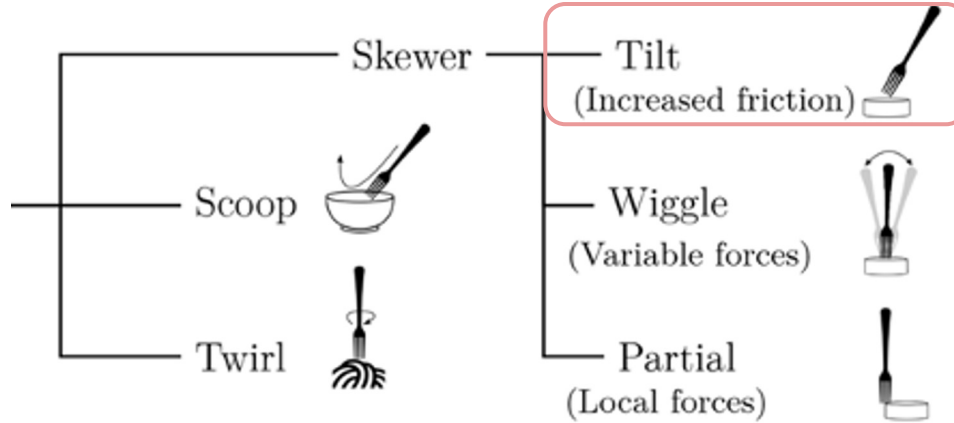
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RQ2: How can a robot-assisted feeding system acquire the large variety of food items users may want to eat?

Bite Acquisition: Past Work



Bhattacharjee, Tapomayukh, et al. "Towards robotic feeding: Role of haptics in fork-based food manipulation." *IEEE Robotics and Automation Letters* (2019)

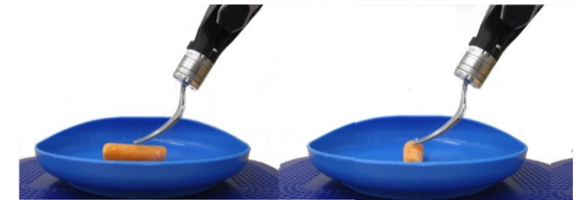
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(VS)



Tines
Vertical
(TV)

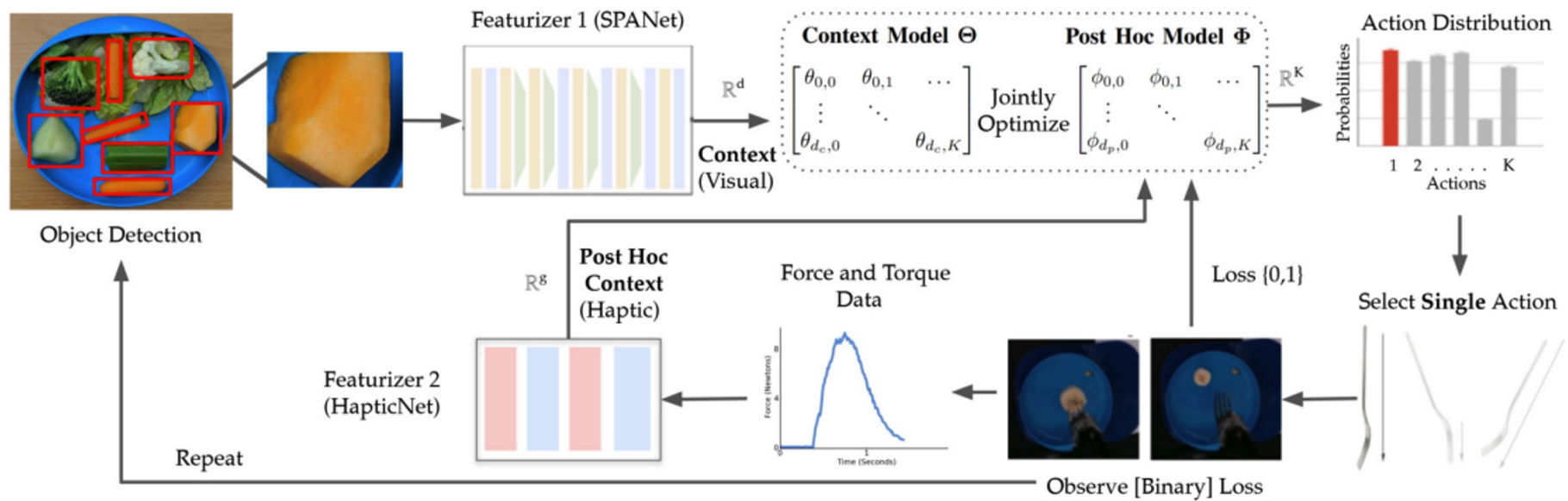


Angled
(TA)



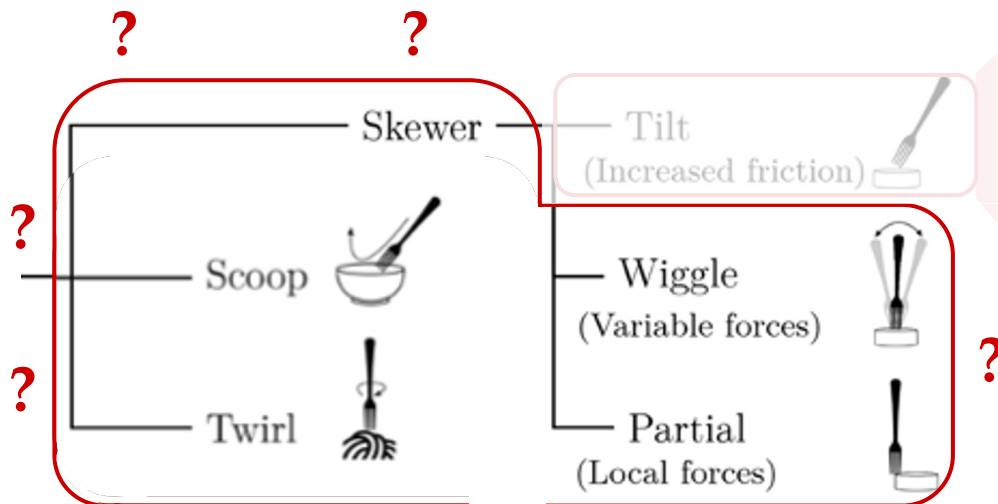
Feng, Ryan, et al. "Robot-assisted feeding: Generalizing skewering strategies across food items on a plate." *The International Symposium of Robotics Research*. (2019)

Bite Acquisition: Past Work



Gordon, Ethan K., et al. "Leveraging post hoc context for faster learning in bandit settings with applications in robot-assisted feeding." *IEEE International Conference on Robotics and Automation (ICRA)*. (2021)

Bite Acquisition: Past Work



Bhattacharjee, Tapomayukh, et al. "Towards robotic feeding: Role of haptics in fork-based food manipulation." *IEEE Robotics and Automation Letters* (2019)

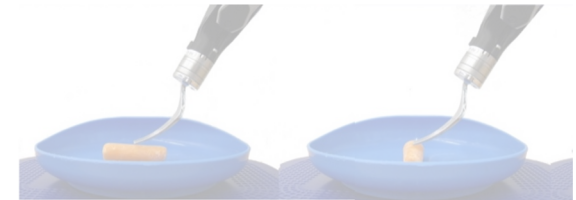
Vertical
(VS)



Tines
Vertical
(TV)



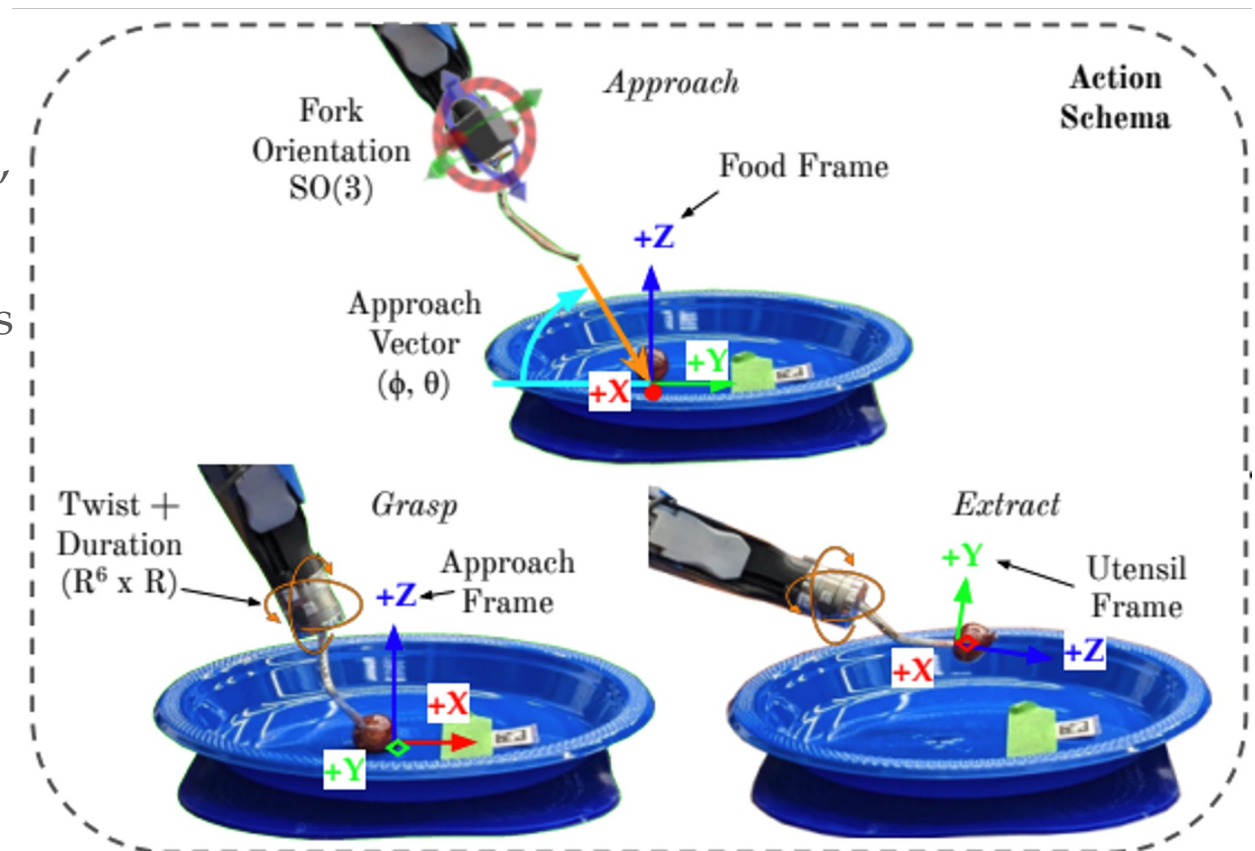
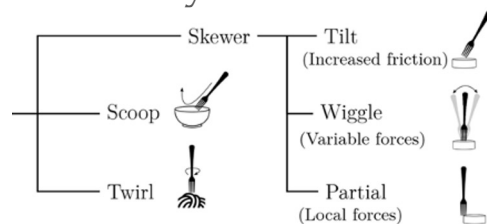
Angled
(TA)



Feng, Ryan, et al. "Robot-assisted feeding: Generalizing skewering strategies across food items on a plate." *The International Symposium of Robotics Research*. (2019)

Representing Actions: Acquisition Schema

- 3 steps: Approach, Grasp, Extract
- 26 continuous parameters
- Encompasses entire taxonomy



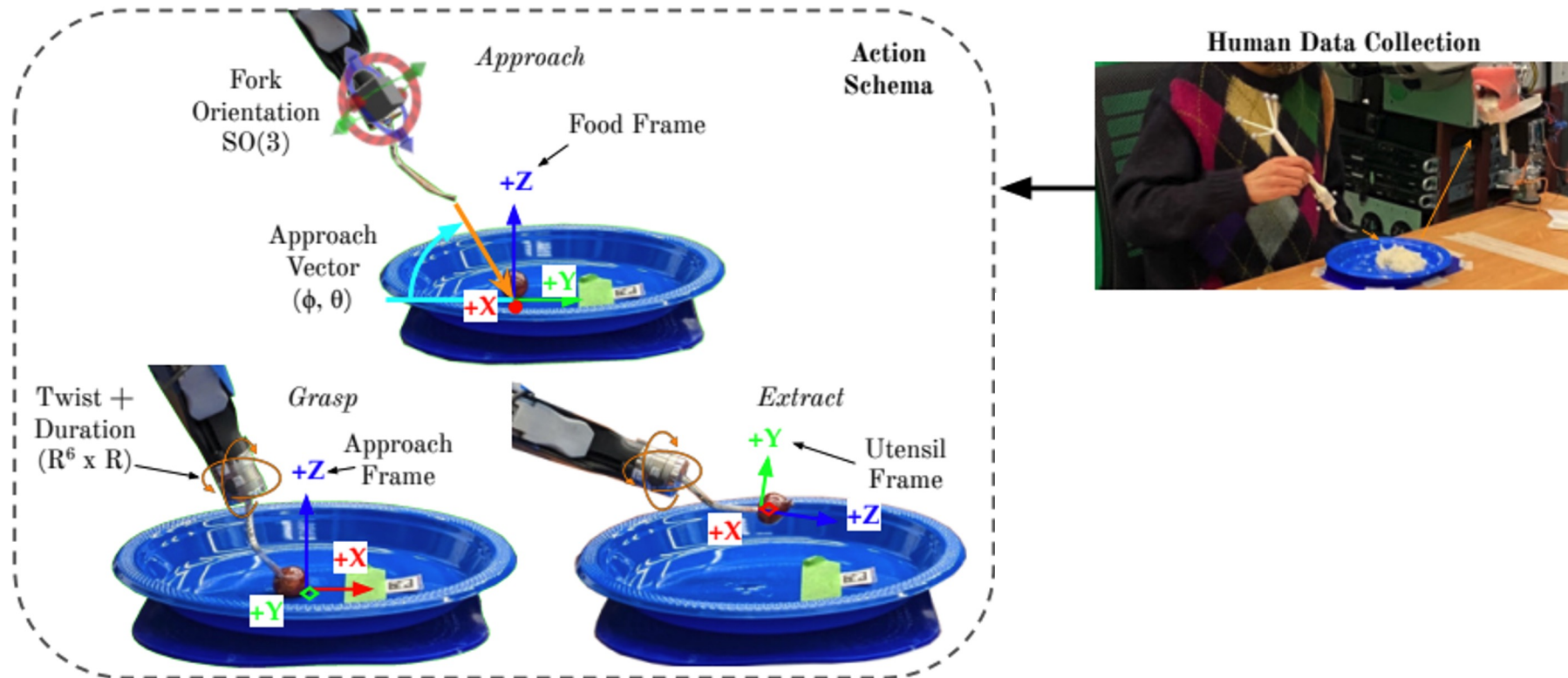
Learning Actions: From Human Data

- Users acquire 13 food items
 - e.g., mashed potatoes, chicken tenders, sandwich bites, jello, noodles, etc.
 - Foods a community researcher ate in a week.
- Capture motion & haptic data
- 496 acquisition trials

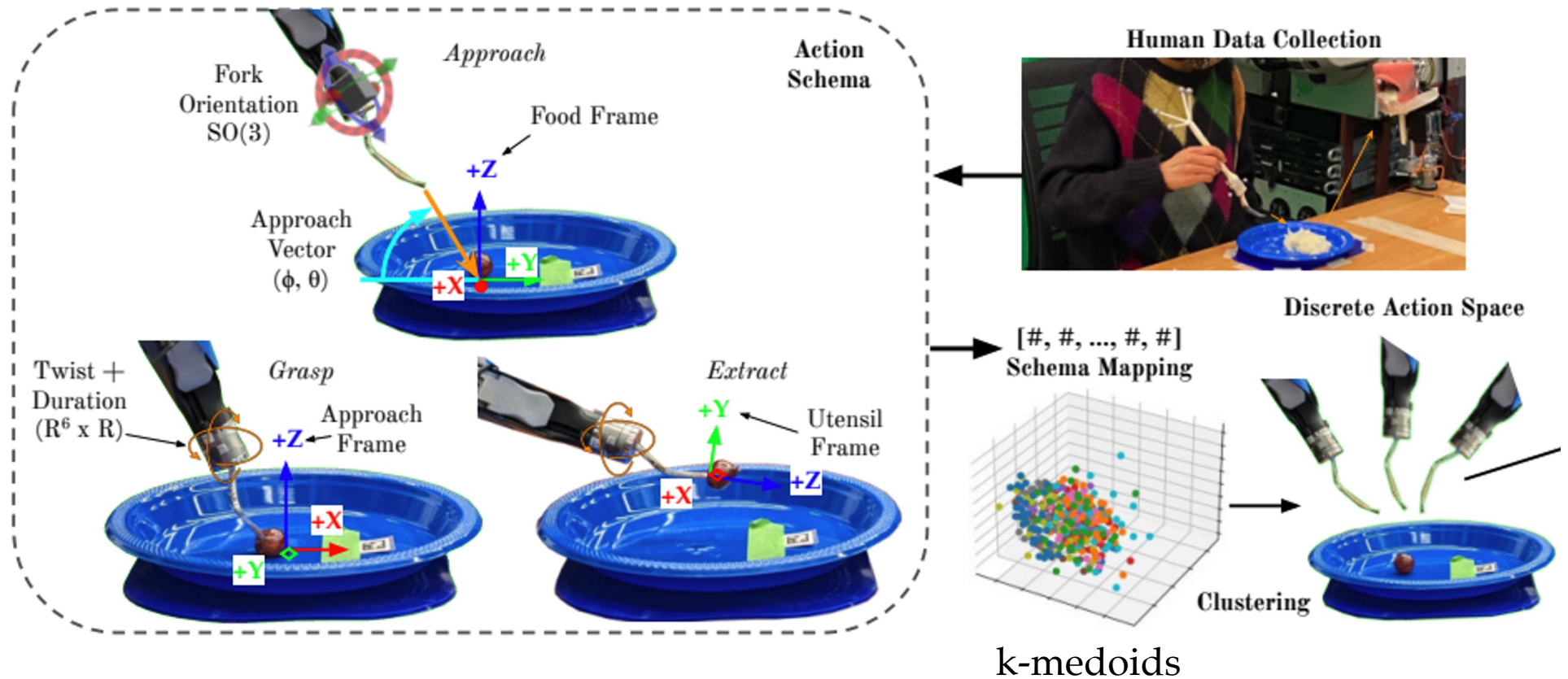
Human Data Collection



Learning Actions: From Human Data



Learning Actions: From Human Data



Discrete Actions: Emergent Behavior

Scooping

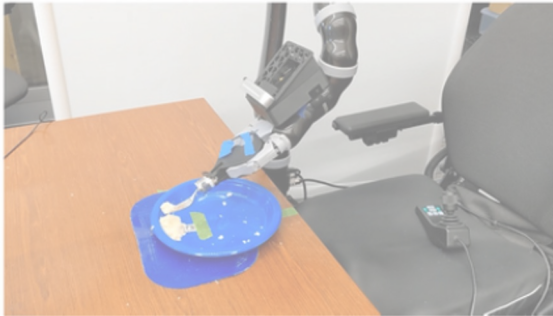
Action 6; Potato



Discrete Actions: Emergent Behavior

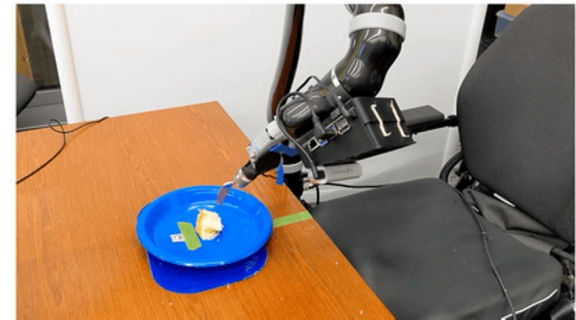
Action 6; Potato

Scooping



Action 10; Sandwich

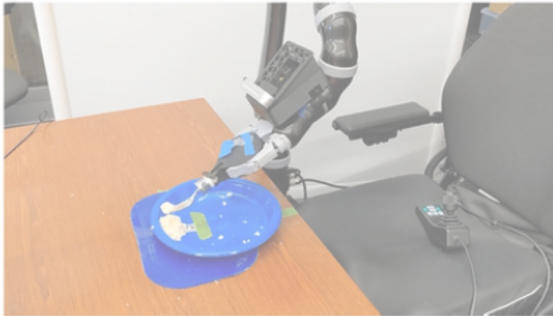
Tilted
Tines for
Higher
Pressure



Discrete Actions: Emergent Behavior

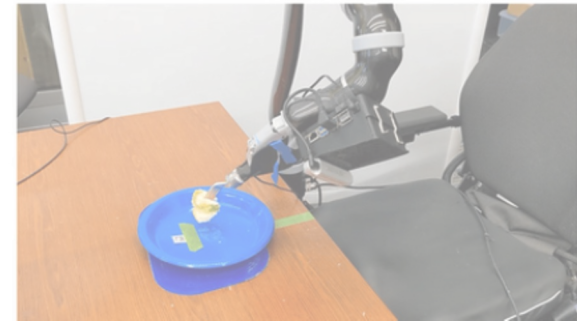
Action 6; Potato

Scooping



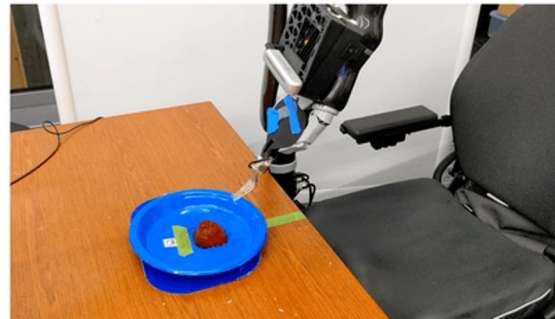
Action 10; Sandwich

Tilted
Tines for
Higher
Pressure



Action 8; Jello

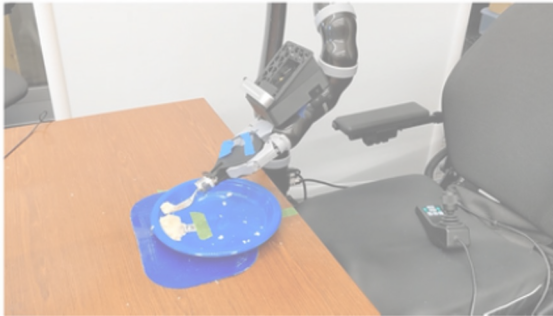
Tilted
Extraction



Evaluating Actions

Action 6; Potato

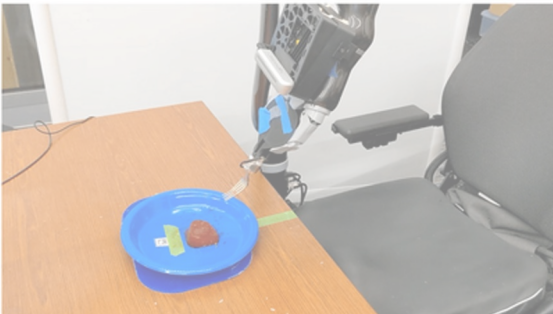
Scooping



⋮

Action 8; Jello

Tilted
Extraction

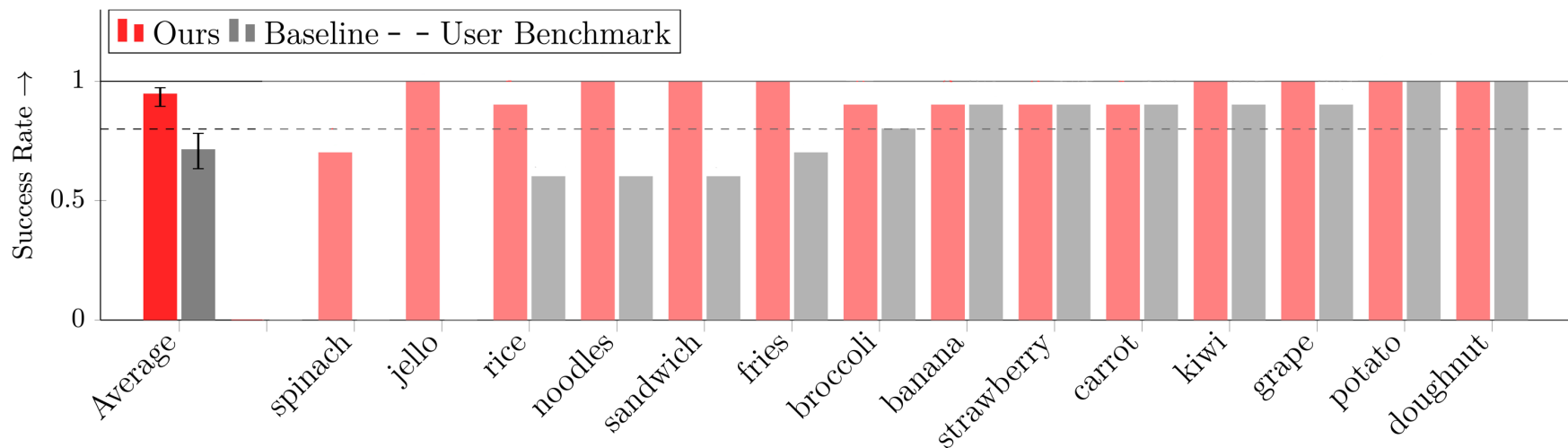


1. Coverage

2. Learnability

14 food items (9 unseen)

Evaluating Actions: Coverage

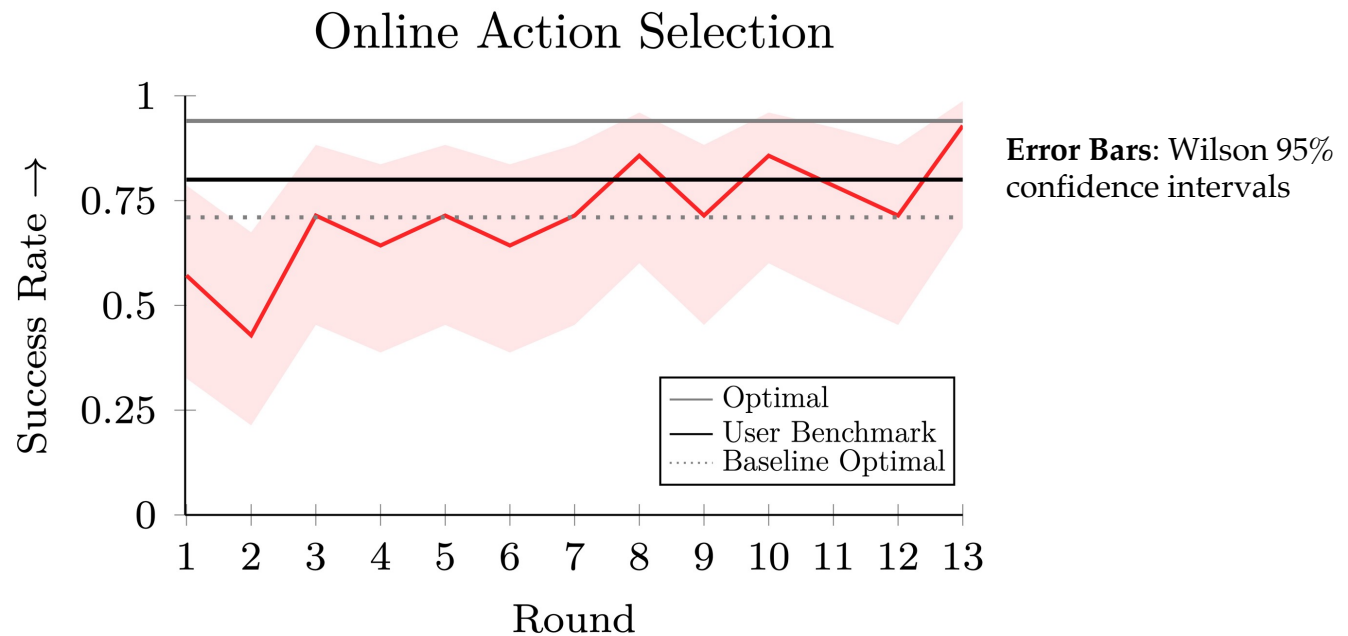


Coverage

For every food item, there exists an action that can acquire it with $\geq 80\%$ success.

Bhattacharjee, Tapomayukh, et al. "Is more autonomy always better? exploring preferences of users with mobility impairments in robot-assisted feeding." *HRI*. (2020)

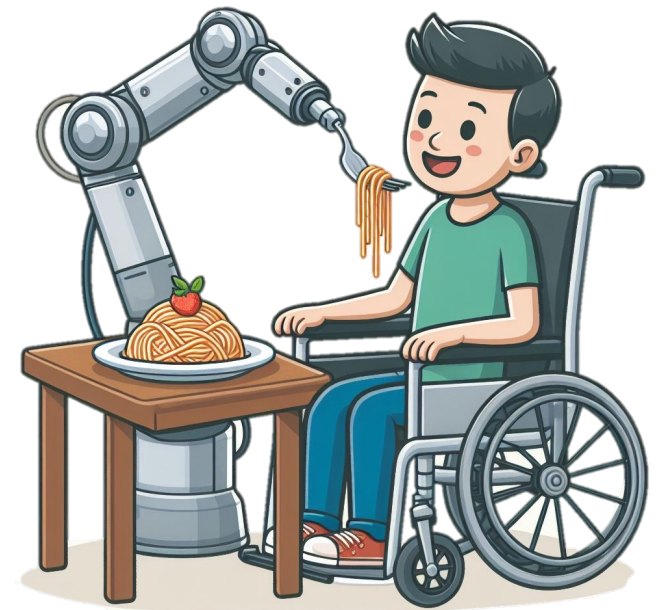
Evaluating Actions: Learnability

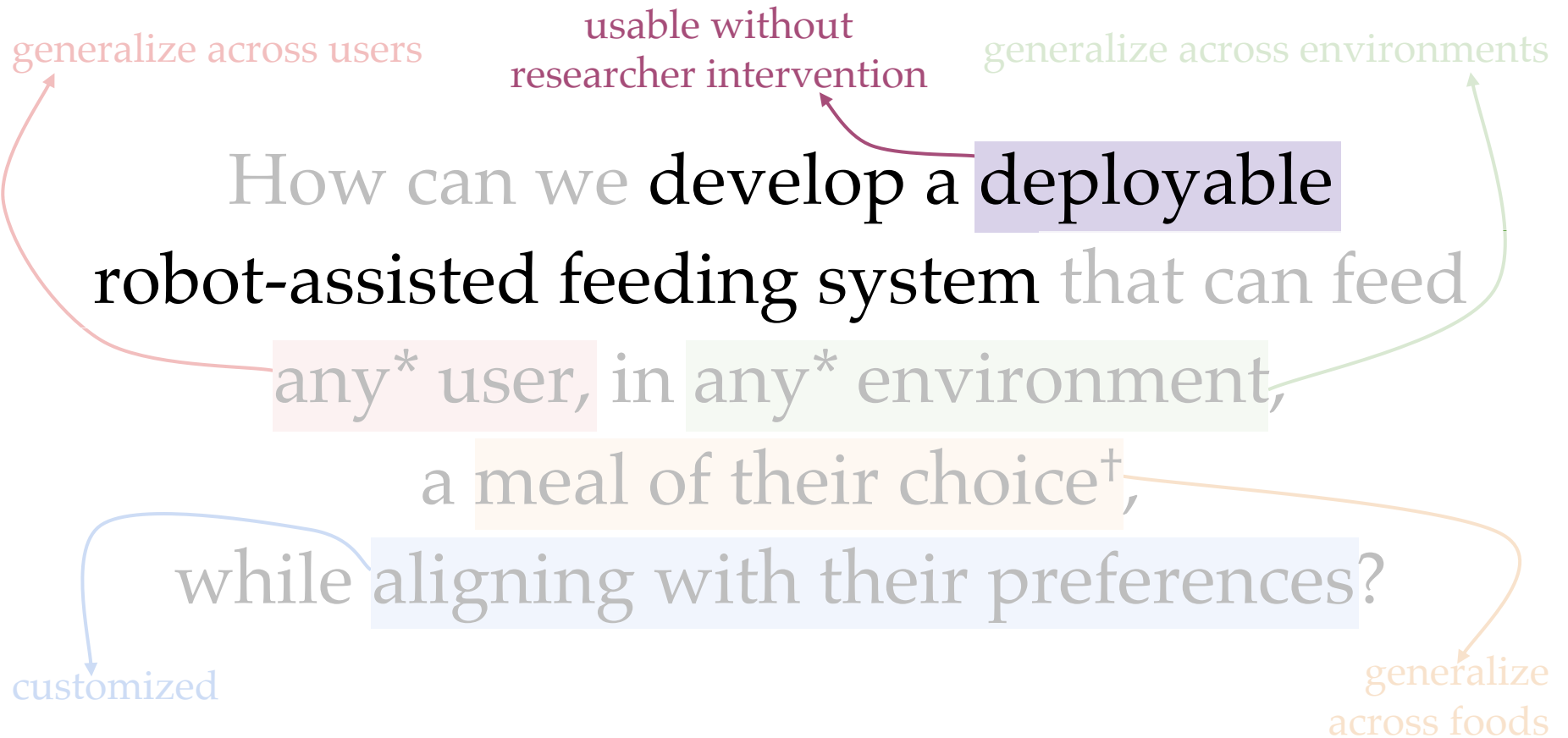


~30s / acquisition \rightarrow learn optimal action in ~4m of pre-meal training!

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RQ3: How can we take a functional robot-assisted feeding system and make it deployable?

Why is “deployable” challenging?

Nominal Scenario:

everything – user, robot, and environment – proceeds according to plan.

Off-Nominal Scenario:

something – user, robot, or environment – does not proceed according to plan.

Firesmith, Donald. “The need to specify requirements for off-nominal behavior”. *CMU Software Engineering Institute Blog*. (2012)

Off-Nominals Scenarios in Robot-Assisted Feeding

User	Robot	Environment
User no longer wants bite	Robot collides with object	Food falls off the fork
User cannot eat (e.g., is coughing)	Robot fails to perceive bite	Plate moves (e.g., caregiver serves food)
User takes a partial bite	Robot fails to acquire bite	Local area network fails
User clicks unintended button	Robot stops far from face	Device running web app fails
...

The multitude & diversity of off-nominals makes it challenging to develop a deployable robot feeding system.

Key Observation:

Users' goal fully aligns with the robot, they are co-located with the robot, and they desire control over their robot.

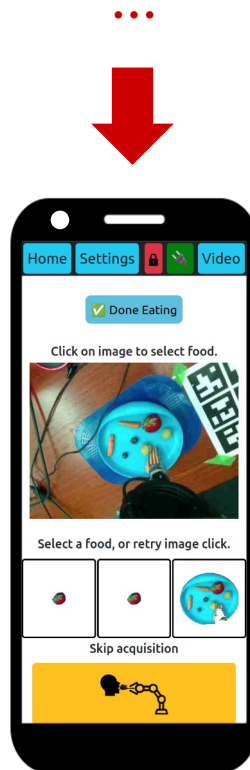
Insight # 1:

Users can resolve off-nominals, given control and transparency.

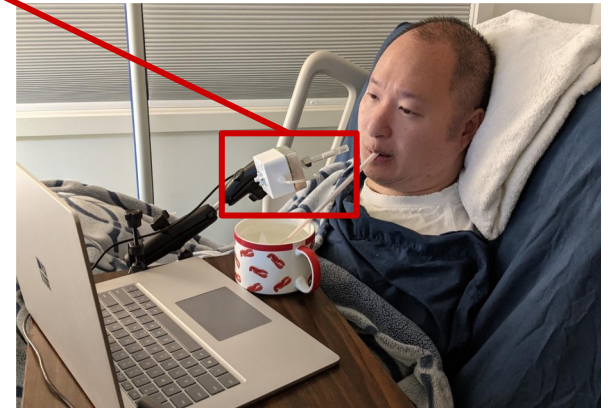
User Interface: Web App



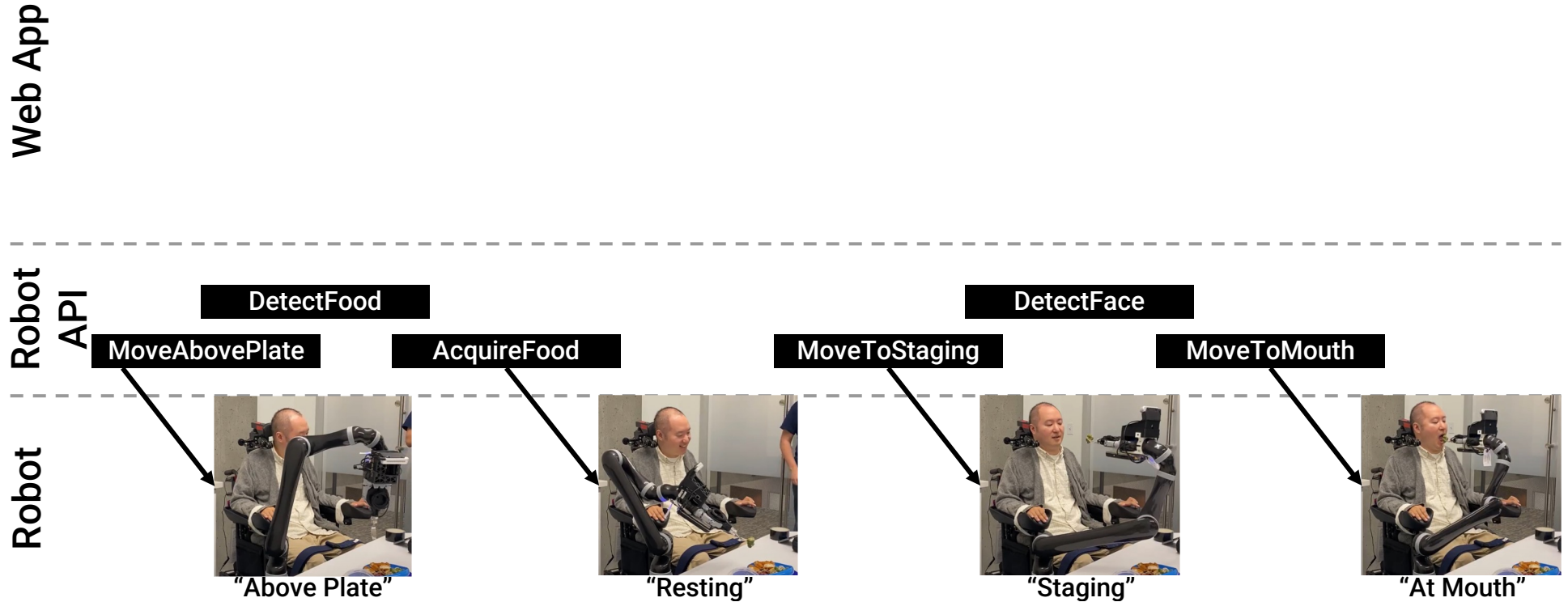
Voice Control



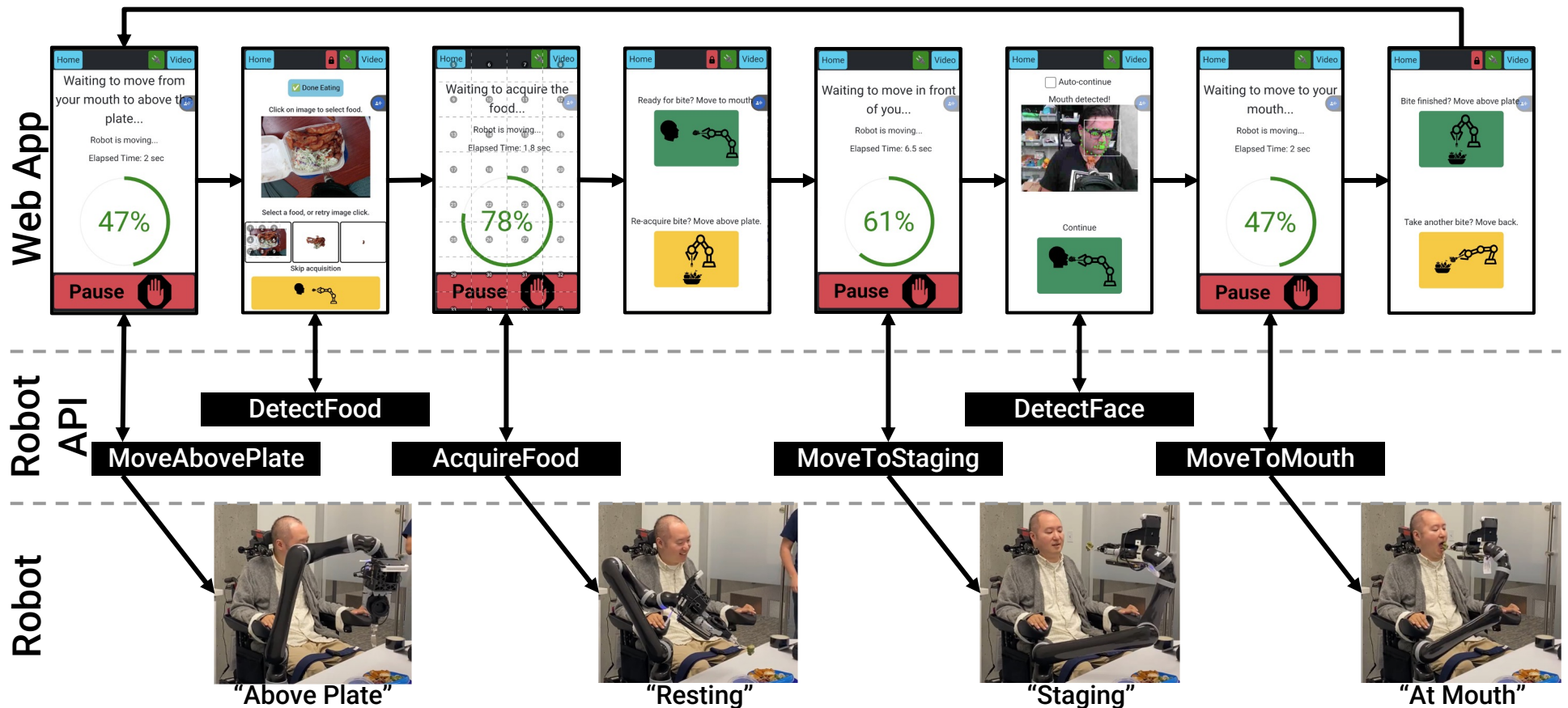
Chin Joystick



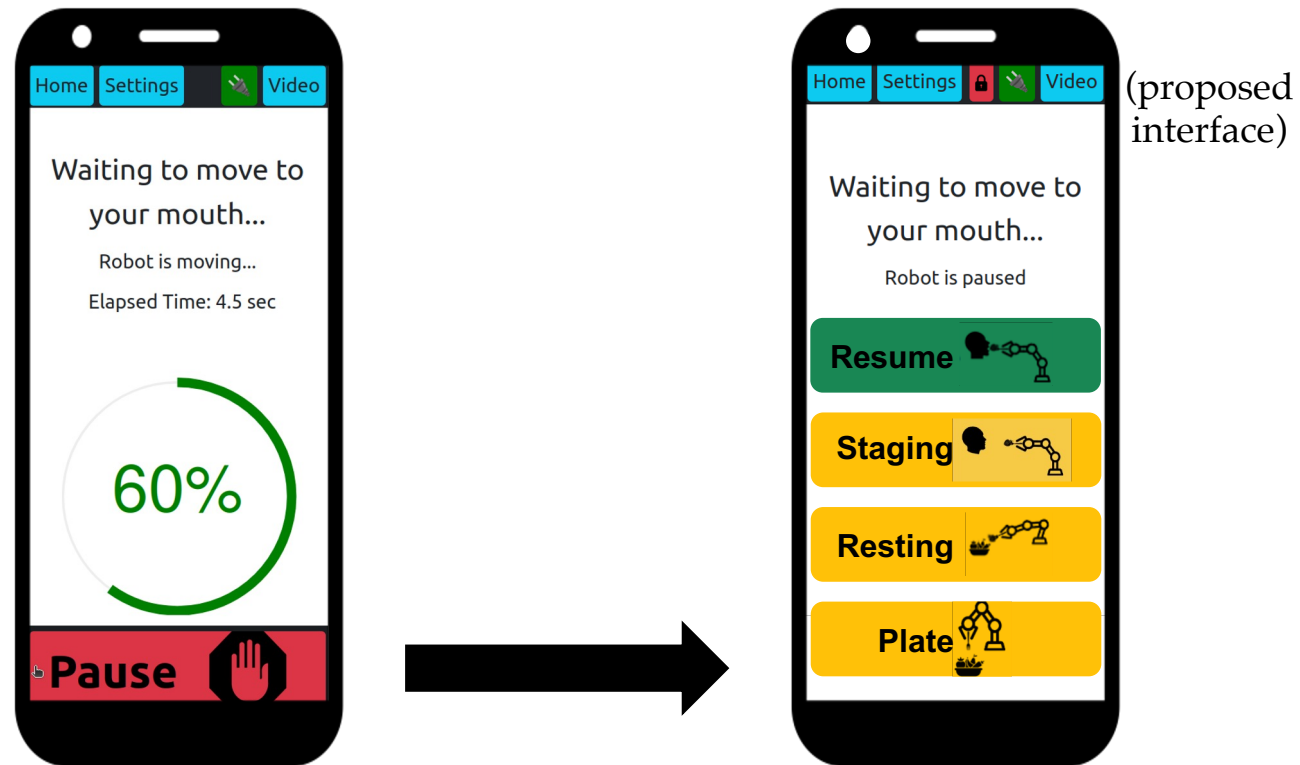
Software Architecture: App Controls Execution!



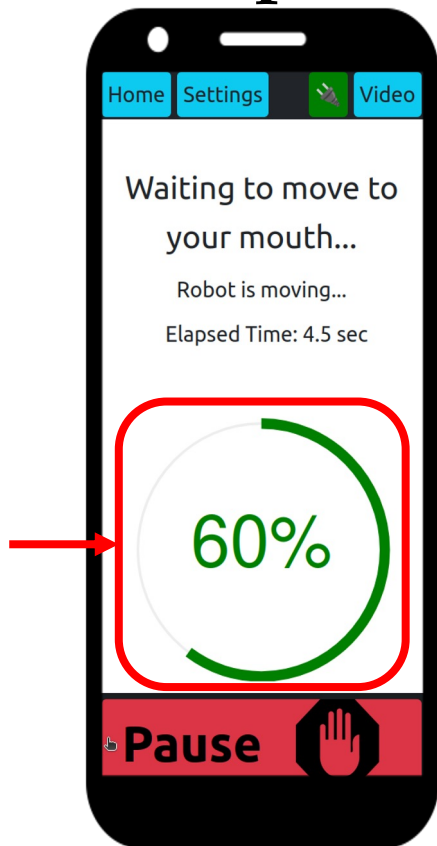
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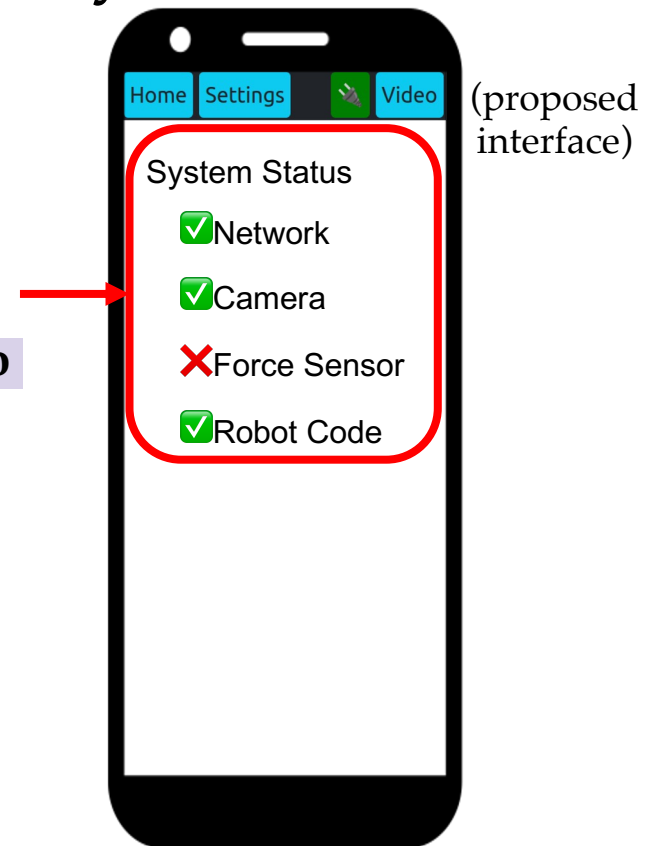
Web App Design Principle: User Control



Transparency is necessary to resolve system issues



Transparency and control are two sides of the same coin when it comes to empower users to resolve off-nominal scenarios.



Key System Design Considerations for Deployability

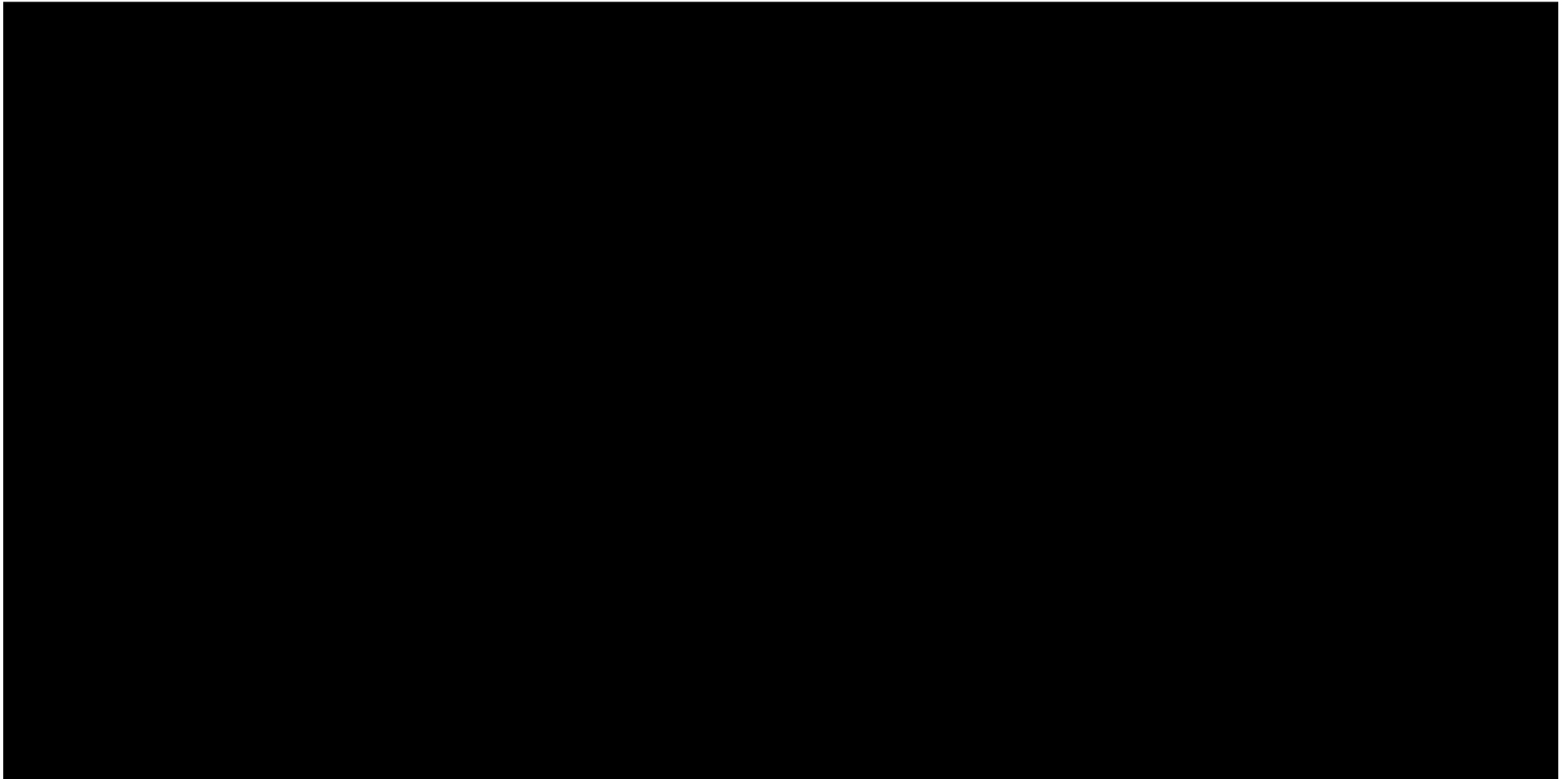
Insight #1: Users can resolve off-nominals, given control & transparency

Insight #2: Safety in all levels of the system

Insight #3: Portability is key

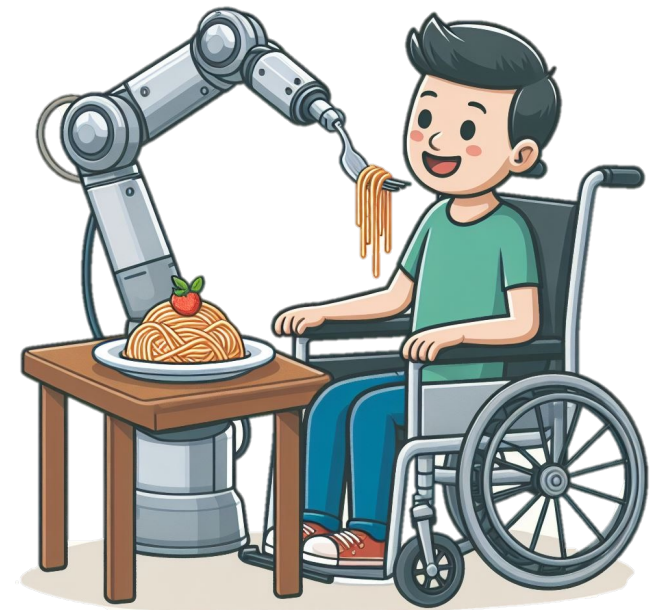


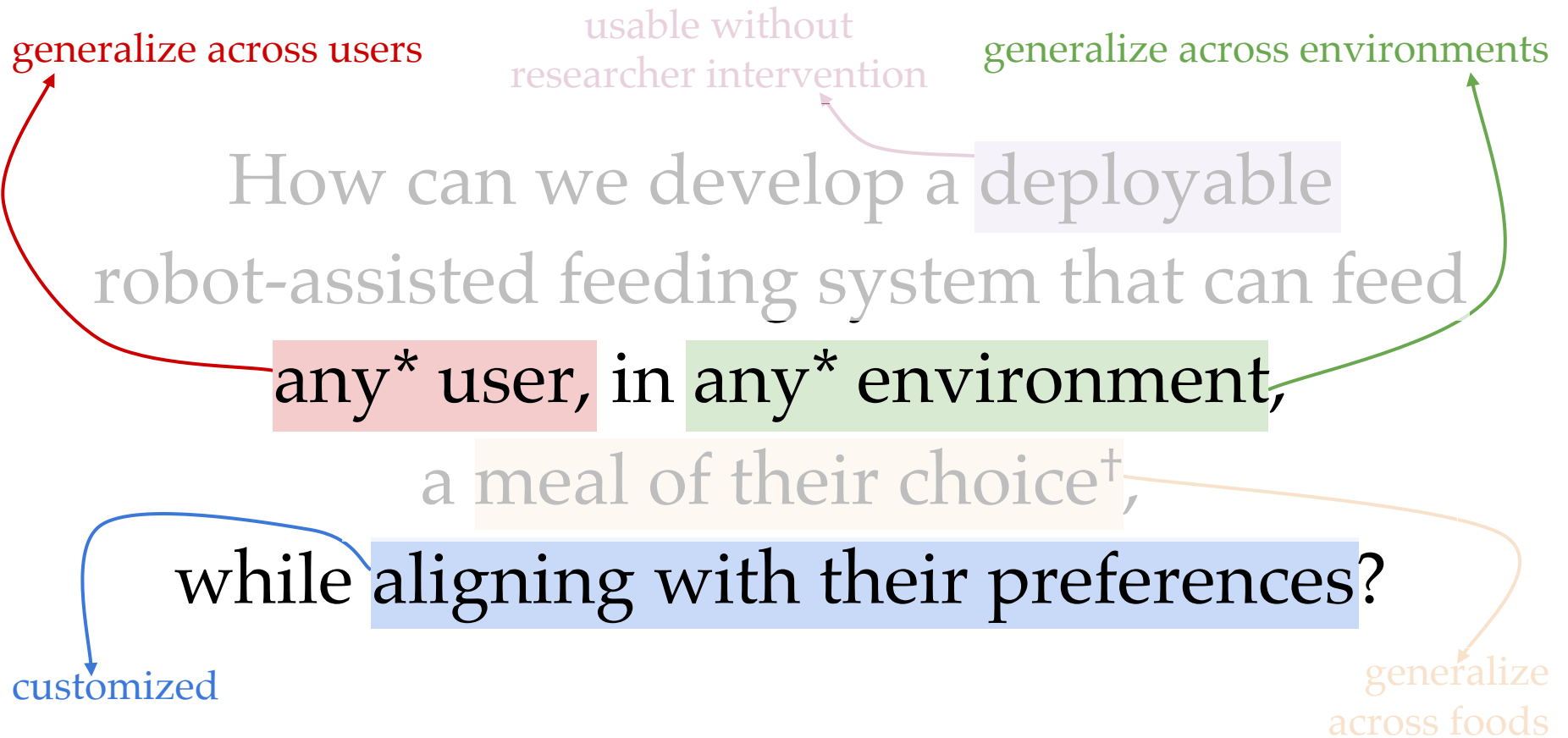
In-Lab Test from Last Month



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RQ4: How can a robot-assisted feeding system customize to users' needs and environments?

Why Customize?

Needs

User can only move their head
a certain distance to the fork

User must be fed from one
side of their mouth

User needs small bites to
prevent choking

...

Nanavati, Amal*, Alves-Oliveira, Patrícia*, et al. "Design principles for robot-assisted feeding in social contexts." *HRI*. (2023)

CUSTOMIZATION



The robot should be adaptable to contexts and user needs.

Why Customize?

Needs

User can only move their head a certain distance to the fork

User must be fed from one side of their mouth

User needs small bites to prevent choking

...

Preferences

User wants the robot to not occupy their visual field

User wants the robot to take human-like arm configurations

User wants the robot to automatically move to their mouth

...

Nanavati, Amal*, Alves-Oliveira, Patrícia*, et al. "Design principles for robot-assisted feeding in social contexts." *HRI*. (2023)

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Environment

User wheelchair is angled relative to the table/plate

User is being fed in-bed, a different relative position to the robot

User wants the robot to not block their TV or social companion

...

Nanavati, Amal*, Alves-Oliveira, Patrícia*, et al. "Design principles for robot-assisted feeding in social contexts." *HRI*. (2023)

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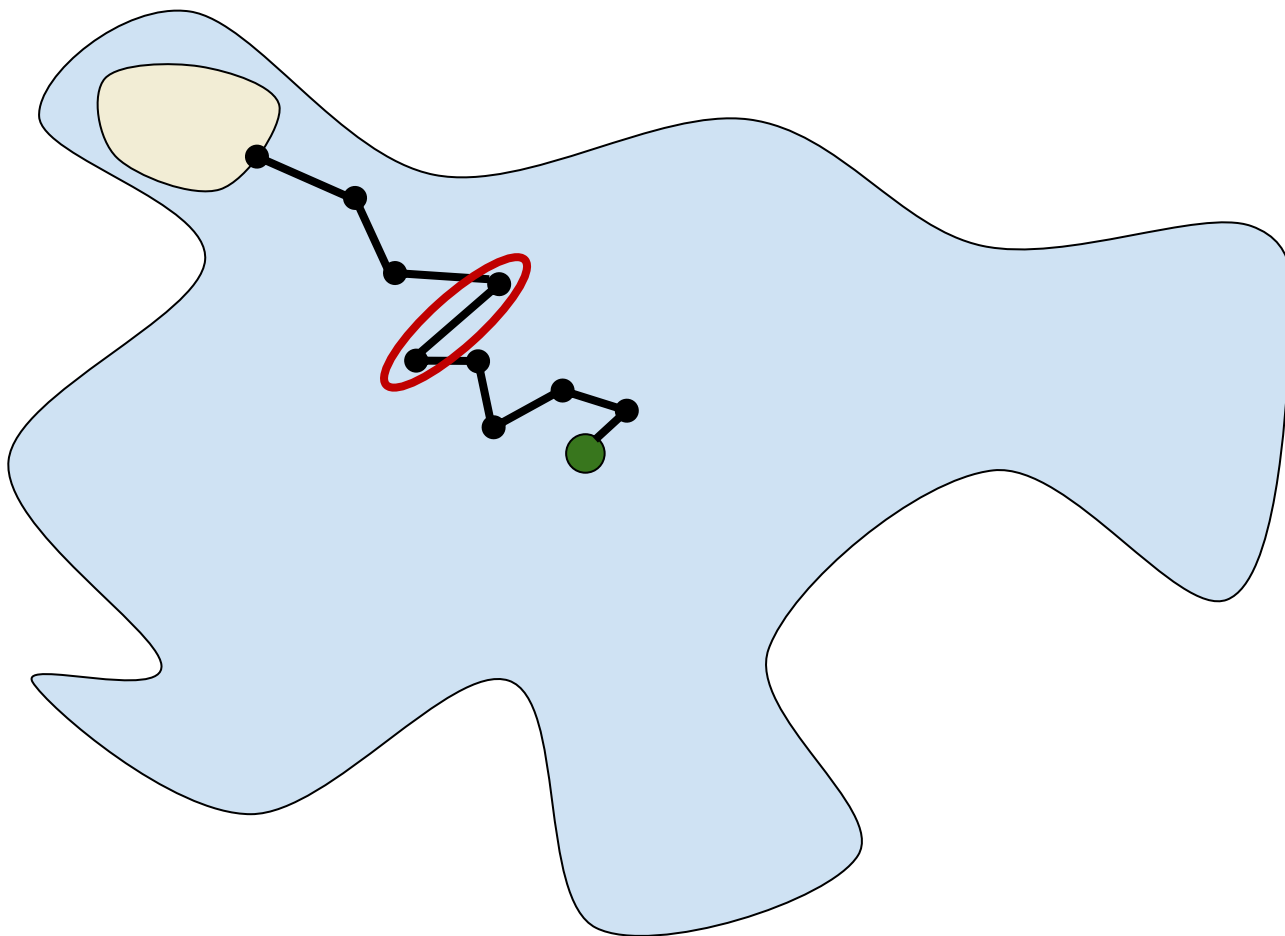
...

Nanavati, Amal*, Alves-Oliveira, Patrícia*, et al. "Design principles for robot-assisted feeding in social contexts." *HRI*. (2023)

CUSTOMIZATION



The robot should be adaptable to contexts and user needs.



Formalization ⁷⁰

parameter
 $\theta \in \Theta$

program
 $f_\theta \in F$

user preferences
 $h : F \rightarrow \mathbb{R}$


user preferred programs
 $\Theta^* = \{\theta | h(f_\theta) \geq \eta\}$


Goal: find some
 $\theta^* \in \Theta^*$

(often done iteratively)
 $\theta_0 \cdots \theta_t \rightarrow \theta_{t+1} \cdots \theta^*$

 Space of parameters, Θ

 Users' preferred parameters, Θ^*

 Init parameter, θ_0

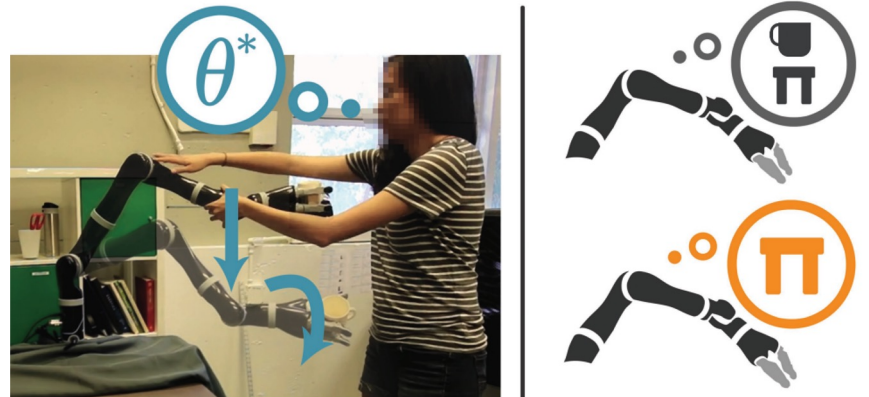
 New parameter, θ_{t+1}

One Approach: “Robot-Driven Customization”



Active Learning

Cakmak, Maya, and Andrea L. Thomaz. "Designing robot learners that ask good questions." *HRI*. (2012).



Learning from Corrections

Bajcsy, Andrea, et al. "Learning from physical human corrections, one feature at a time." *HRI*. (2018)

typically requires an *explicit* model of user preferences:

$$h(f_\theta | w) = w \cdot \Phi(f_\theta)$$

including the features users care about: $\Phi(f_\theta)$

One Approach: "Robot-Driven Customization"

Pro: It works well across many tasks.

Con: User frustration due to insufficient control and transparency.

Amershi, Saleema, et al. "Power to the people: The role of humans in interactive machine learning." *Ai Magazine* 35.4 (2014)

questions." *HRI*. (2012).

including the features users care about: $\Phi(f_\theta)$

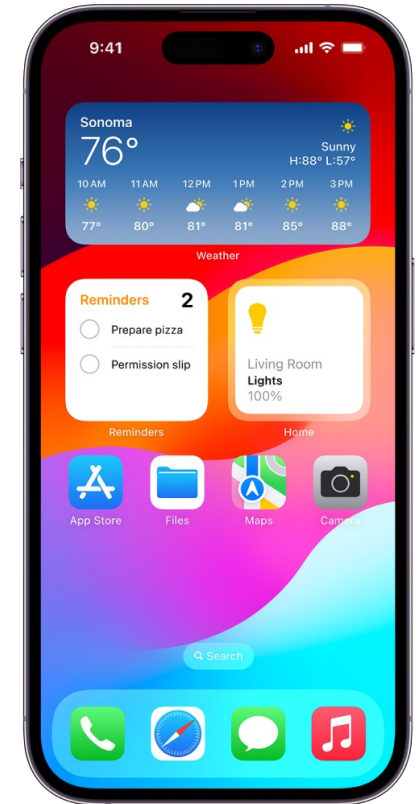
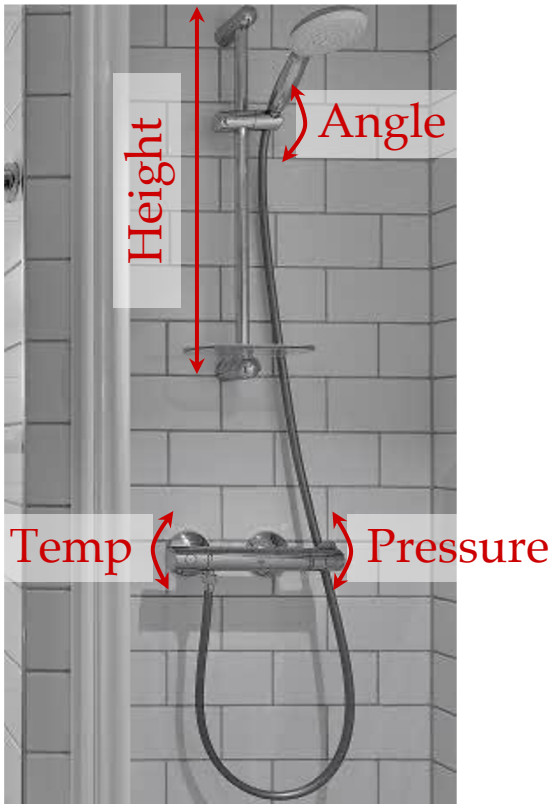
Key Observation:

Users are experts at what they want.

Key Insight:

By providing intuitive knobs, we can empower users to directly customize their robot.

(User-Driven) Customization Everywhere!



Proposed Work:

1. Design user-driven customization for the robot-assisted feeding system.
2. Run a user study investigating users' perceived tradeoffs between user-driven and robot-driven customization.

What to Customize?

Needs

User can only move their head a certain distance to the fork

User must be fed from one side of their mouth

User needs small bites to prevent choking

...

Preferences

User wants the robot to not occupy their visual field

User wants the robot to take human-like arm configurations

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...

Environment

User wheelchair is angled relative to the table/plate

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User wants the robot to not block their TV or social companion

...



Bite Transfer: staging configuration (6D) + distance to mouth (1D)

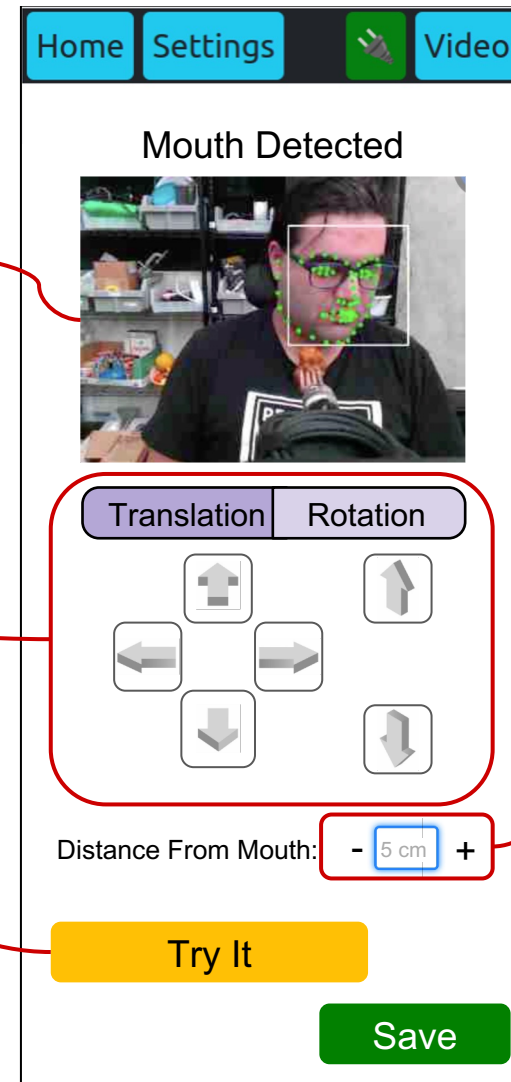
User-Driven Customization

Transparently expose technical constraints to user

Give users free control to tune the parameter(s)

Allow users to immediately try robot behavior with the set parameter(s)

Resnick, Mitchel, and Eric Rosenbaum. "Designing for tinkerability." *Design, make, play: Growing the next generation of STEM innovators* (2013)



(proposed interface)

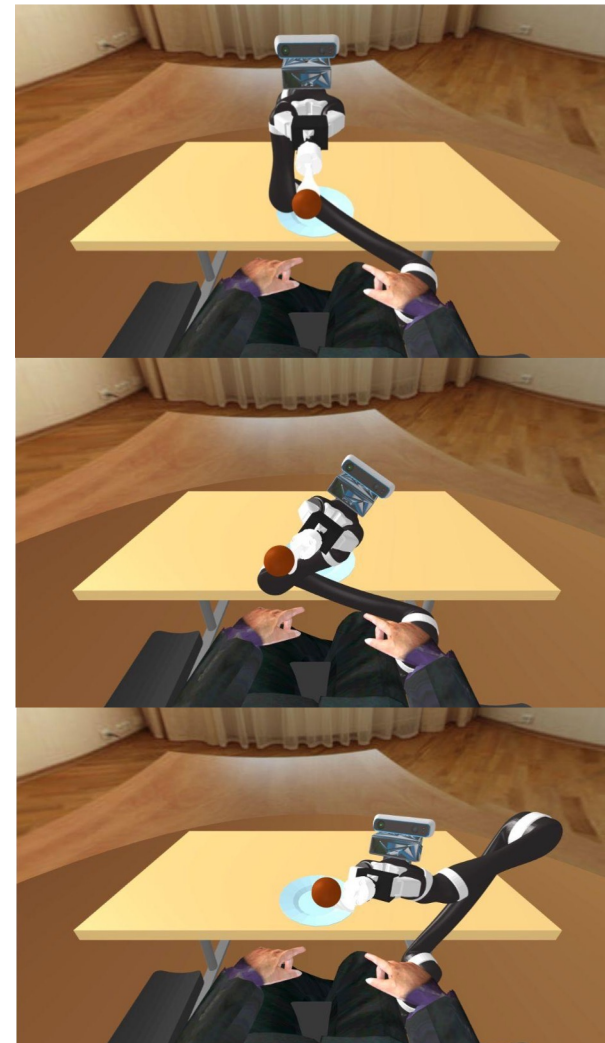
Accessible interface

Robot-Driven Customization

Features $\Phi(f_\theta)$: fork centering, robot height, visual occlusion, zig-zagginess, etc.

User Preferences:

$$h(f_\theta | w) = w \cdot \Phi(f_\theta)$$



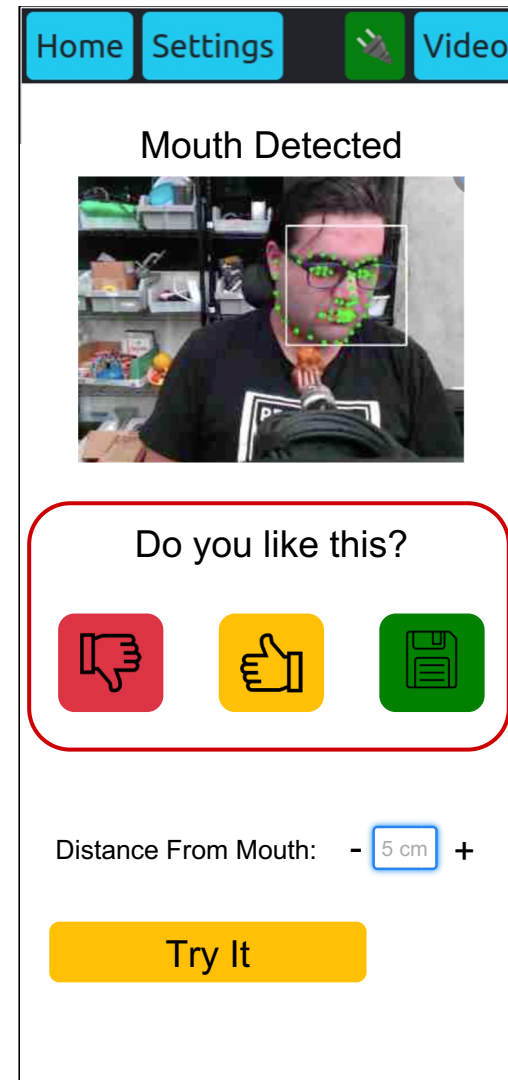
Robot-Driven Customization

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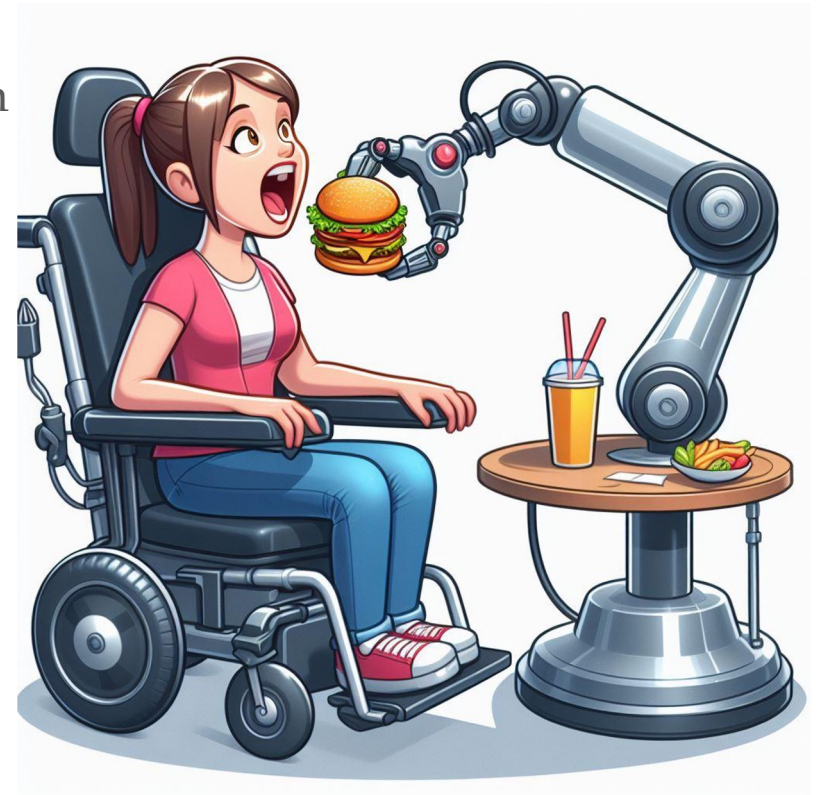
- Robot samples staging configuration.
- Users provide binary feedback.
- Robot uses feedback to generate another sample.
- **Algorithm (Bayesian Optimization):**
Thompson Sampling + Laplace Approximation



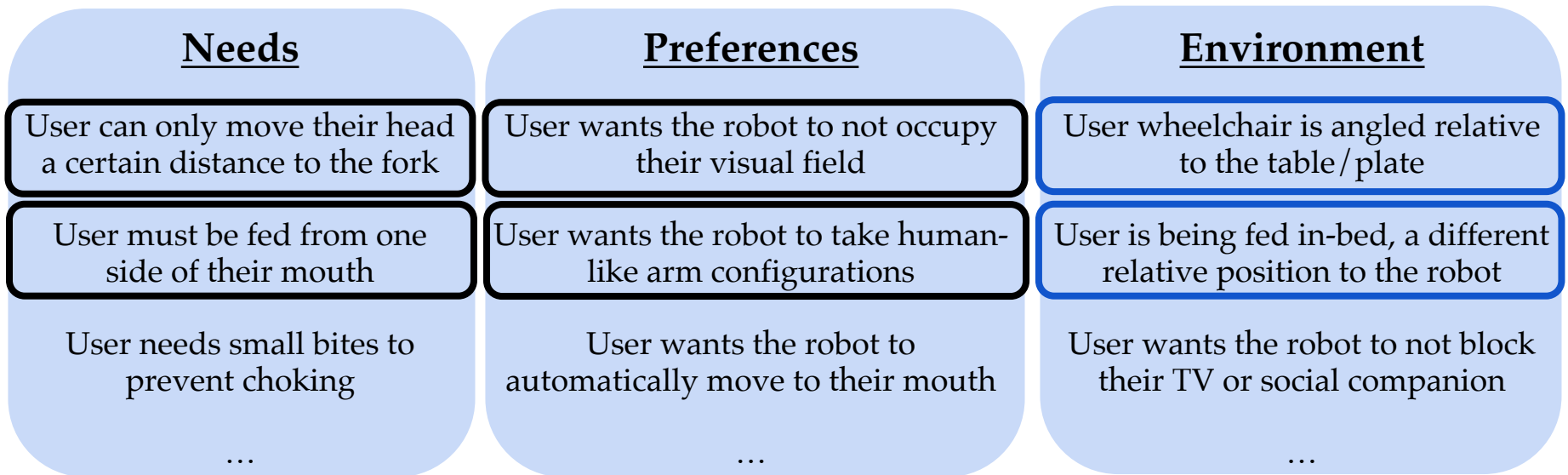
(proposed interface)

Proposed Study

- Users try both user-driven and robot-driven customization (within-subjects)
- Objective Metrics:
 - Time to customize (sec)
- Subjective Metrics:
 - Feeling of customization (5-point Likert)
 - Cognitive Workload & Frustration (NASA-TLX)
 - Preferred customization experience (force-choice)
- Hypotheses:
 - **User-driven customization:** shorter time-to-customize and higher feelings of customization.
 - **Robot-driven customization:** lower cognitive workload but higher frustration.



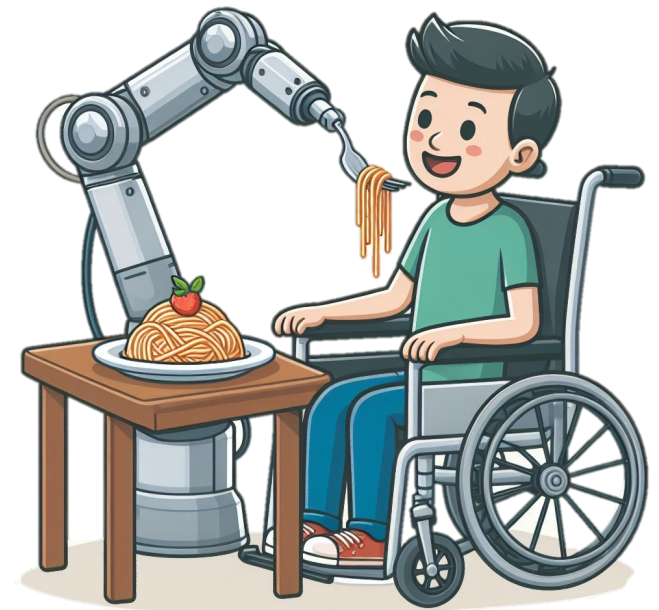
The Power of Customizing Arm Configurations

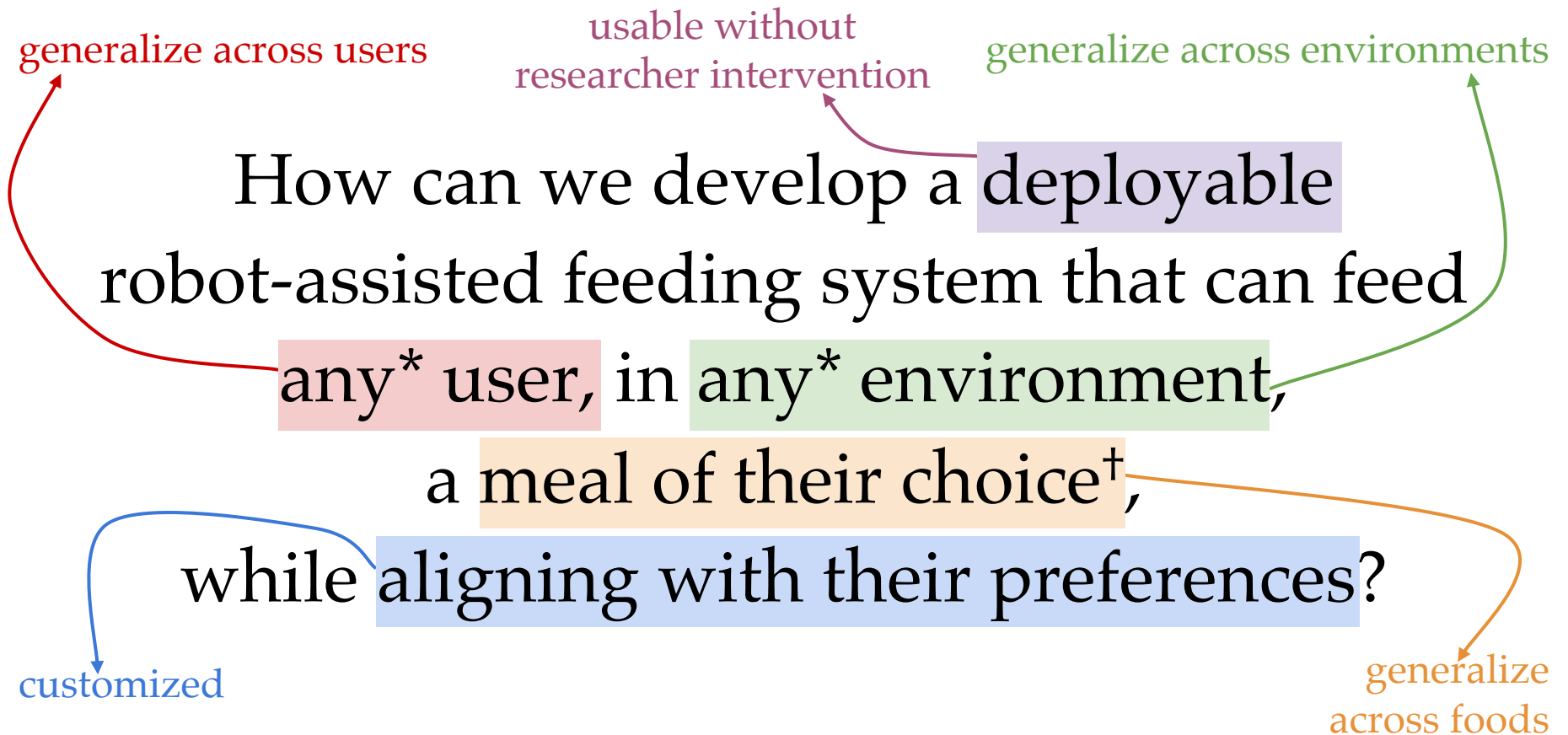


Bonus: Customizing to relative positioning of user/robot/plate.

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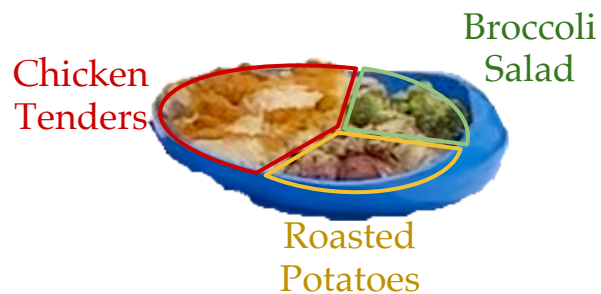




* “any” = North Star.
Demonstrate it with “multiple”

[†] that can be acquired with
a single arm using a fork

Pilot Single-Meal Deployment (3 weeks ago)



Hot off the QFC
(supermarket) shelf!

~ 1m30s per bite
(and we'll make it faster 😊)



Pilot Single-Meal Deployment (3 weeks ago)



Hot off the QFC
(supermarket) shelf!

~ 1m30s per bite
(and we'll make it faster 😊)

What Remains? (Proposed Work)

- Customization
- Transparency & control to resolve system errors
- Testing in less structured environments

Evaluations

- n=5 single-meal deployments
 - conference room, atrium, cafeteria, etc.
 - a meal of their choice
 - **Metrics:** # researcher interventions, time per bite, cognitive workload (NASA-TLX), usability (SUS)
- n=1 in-home deployment
 - one week, e.g., 10 lunches & dinners
 - n-of-1 experimental design*
 - alternate caregiver-fed and robot-fed meals
 - **Metrics:** meal length, stress levels, feelings of self-efficacy, caregiver time
 - (perhaps) bed-side feeding?



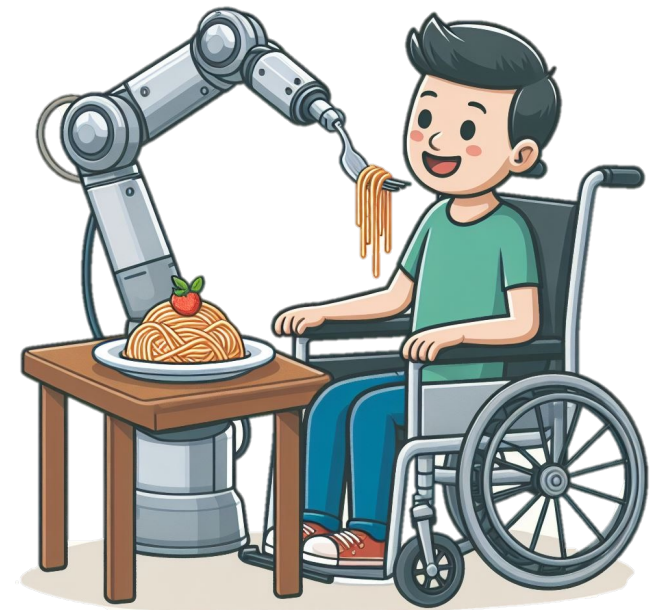
*Tate, Robyn L., and Michael Perdices. "N-of-1 trials in the behavioral sciences." *The essential guide to N-of-1 trials in health* (2015)

Timeline

Research Question(s)	End Quarter	Milestone(s)
Needs Assessment (RQ1) & Acquisition (RQ2)	Autumn 2023	Pilot Single-Meal Deployment: 1 user
Customizability (RQ4) & Deployability (RQ3)	Winter 2024	Single-Meal Deployments: 5 users
Deployability (RQ3)	Spring 2024	In-Home Deployment & Bed-side Feeding
<i>Potential Internship</i>	<i>Summer 2024</i>	<i>N/A</i>
Customizability (RQ4)	Autumn 2024	RQ4 Study
(RQ-Thesis)	Winter 2025	Dissertation & Defense

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Community Researchers

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Haya Bolotski
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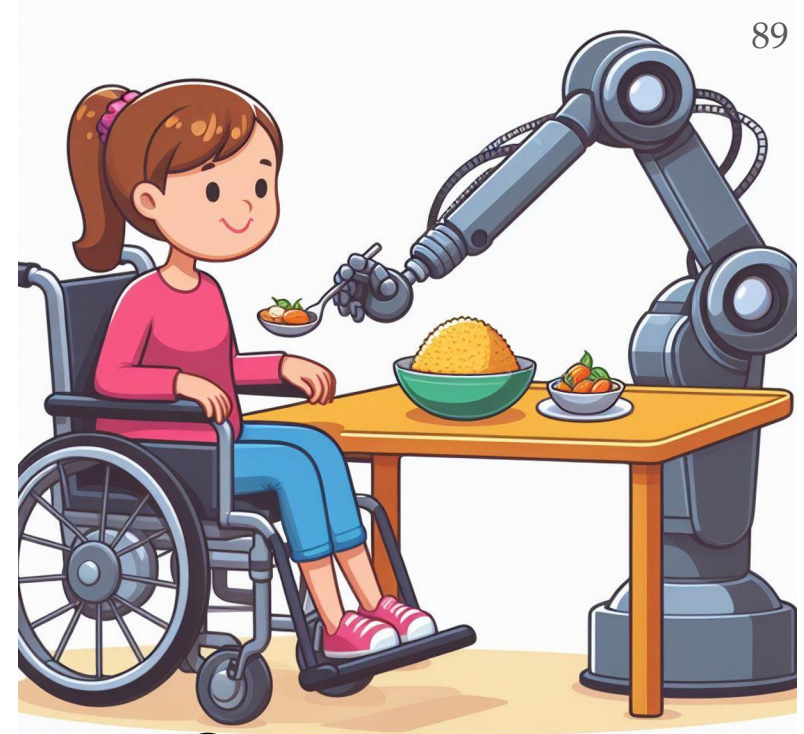
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Maya Cakmak
Siddhartha Srinivasa



Committee

Anat Caspi
Henny Admoni
Kim Ingraham



Thank You Any Questions?

robotfeeding.io

