



# MODULE 1: INTRODUCTION TO HUMAN FACTORS IN SOCIAL ROBOTS

Institute of System Science, NUS



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- PhD and Bachelor of Mechanical Engineering with Robotics Specialization from NTU
- More than 14 years of sensorization, software simulation, intelligent system, digital solution development and integration using industrial IoT and automation technologies in both public and private sectors
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# Course Outline



- Day 1      Module 1: Introduction to Human Factors in Social Robots  
                 Module 2: Robot Operating System
- Day 2      Module 3: Planning under Uncertainty with Markov Decision Process  
                 Module 4: Human Factors in Autonomous Driving
- Day 3      Module 5: Controlled Experiment Design  
                 Module 6: Heterogeneous Human Robot Interactive Systems
- Day 4      Module 7: Human-Robot Interaction: Design and Build Workshop  
                 Final Presentation and Written Assessment



# Objectives



- To acquire the knowledge of designing human-centred interactive systems with robots

- Introduction
- Remote vs Proximate Interactions
- Human & Robot Errors
- Mental models
- Usability
- Design Process for Human Robots Interaction



<https://youtu.be/SOtPCX7Bs4o?si=-mto1Vu9lcVHfE0z&t=112>



[https://youtu.be/j4DkfKALnag?si=oPIEJTQ3\\_lq7ZSP&t=141](https://youtu.be/j4DkfKALnag?si=oPIEJTQ3_lq7ZSP&t=141)





<https://www.youtube.com/watch?v=R1JfVN76kAI>





<https://www.youtube.com/watch?v=4lryrrR4zpU>



# Introduction



- Human-Robot Interaction (HRI) is a field of study dedicated to **understanding, designing, and evaluating robotic systems for use by or with humans**
- HRI may take several forms, but are **largely influenced by whether the human and the robot are in close proximity or not**
- Two general categories:
  - Remote interactions
  - Proximate interactions

# What categories are they in?

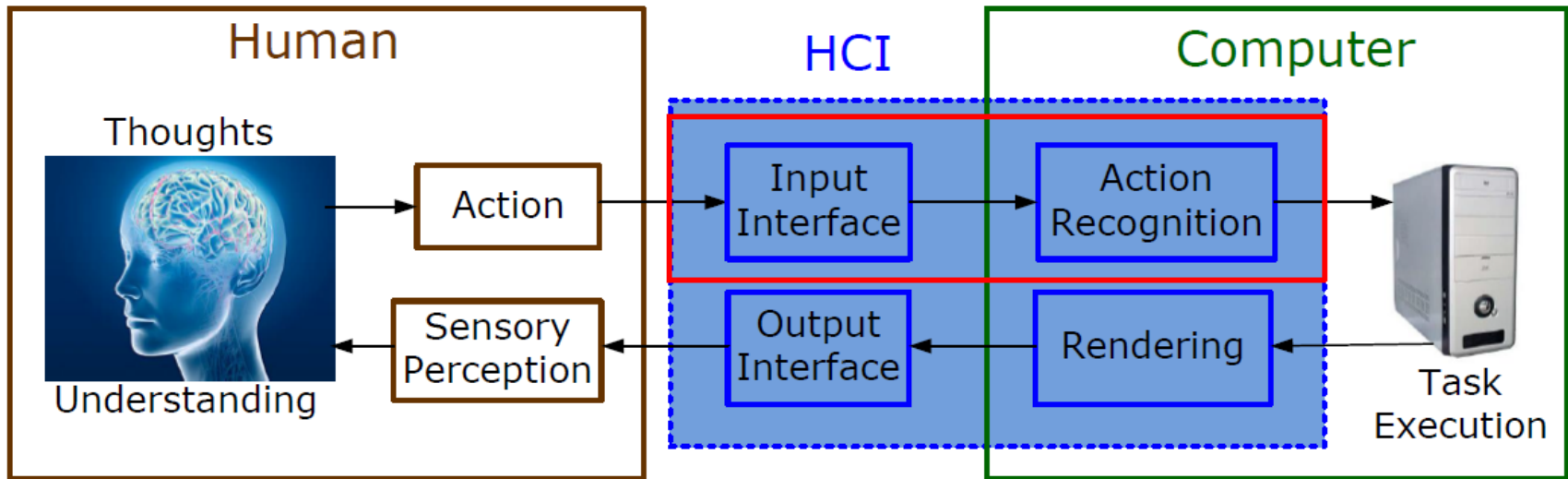




# Human-Computer Interface (HCI)



- HCI is the medium that links man and robot
- HCI design and planning is critical for smooth operability and computing



Source: Human-Computer Interfaces and Wearable Computing. Jeffrey Funk. MT5009 - Analyzing Hi-Technology Opportunities.

Input interfaces and their respective recognition are the main focus of this course.

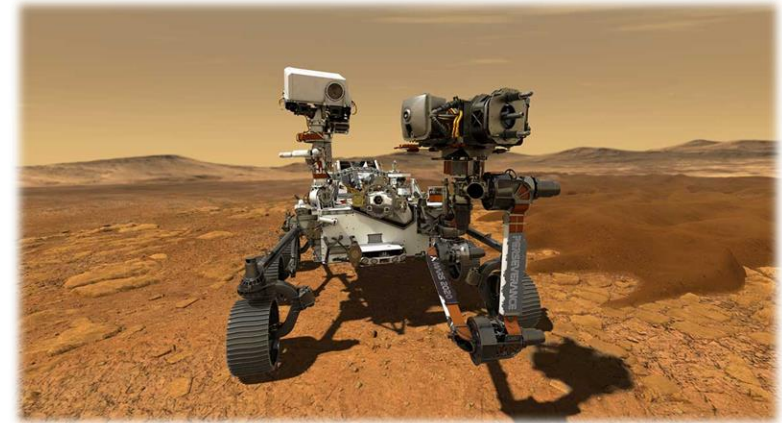




# Remote interaction



- Remote interaction with **mobile robot** → **Teleoperation** or supervisory control



<https://mars.nasa.gov/mars2020/>

- Remote interaction with **physical manipulator** → **Telemanipulation**



<https://www.flushinghospital.org/newsletter/facts-about-robotic-surgery/>

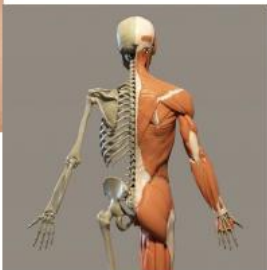
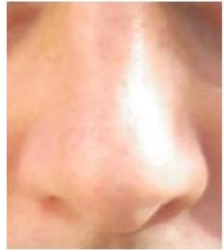


# Proximate interactions



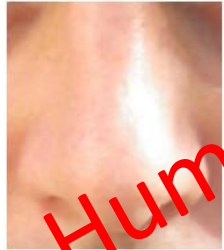
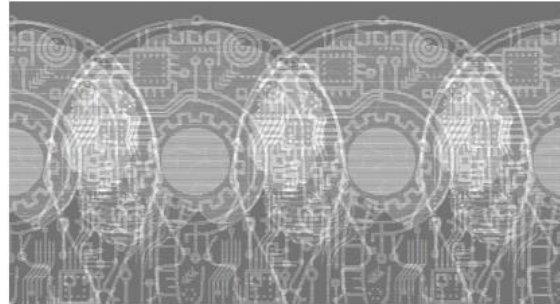
- **Proximate interaction with mobile robots:**
  - E.g. Robot assistant, receptionist
  - May include physical or social interactions
  - Physical → Collision avoidance
  - Social → Communications or collaborations
- **Social interaction types:**
  - Social, emotive and/or cognitive
  - More in proximate rather than remote





## TASK





## TASK





# HUMAN ERRORS



- Trivial OR serious?
- Why?
  - Mental model: we build our own theories to understand the causal behavior of the systems.
  - Characteristics of mental model
    - Partial
    - Unstable and subject to change
    - Internally inconsistent
    - Unscientific, superstition > evidence
    - Incorrect interpretation of the evidence
- **Human errors occur if mental model differs from reality (e.g. emotions, distractions)**
- HRI system designers needs to pay attention to
  - importance of a correct mental model
  - dangers of ignoring conventions



# HUMAN ERRORS



<https://www.youtube.com/watch?v=vxqBS2-4puw&t=5s>



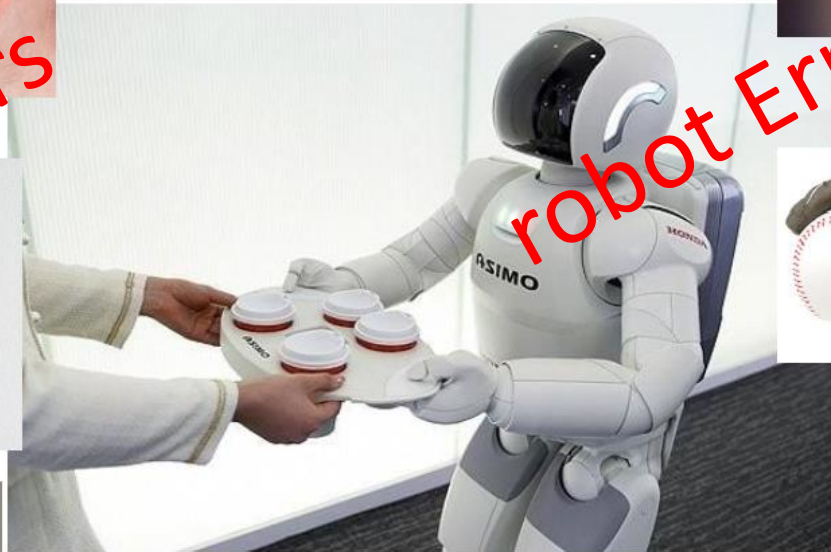
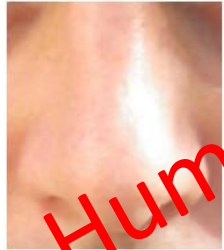
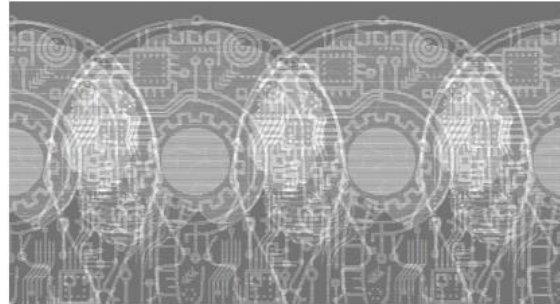
## Waymo's Self-Driving Car Crash in Arizona Revives Tough Questions

Whether or not the autonomous Pacifica minivan was at fault, it's bad news for a young industry trying to prove it can make roads safer for everyone.

- A self-driving Waymo minivan, operated by a human driver, was involved in a crash in Chandler, Arizona.
- A Honda sedan ran a red light, swerved to avoid another vehicle, and collided with the Waymo minivan, which was within the speed limit and following traffic laws.
- Waymo's preliminary data and video evidence suggest that their vehicle was not at fault.
- The crash involving a Waymo self-driving vehicle in Arizona, although not the fault of the autonomous car, has brought back difficult questions about the readiness and safety of autonomous driving technology.



<https://www.wired.com/story/waymo-crash-self-driving-google-arizona/>



Human Errors

robot Errors

TASK

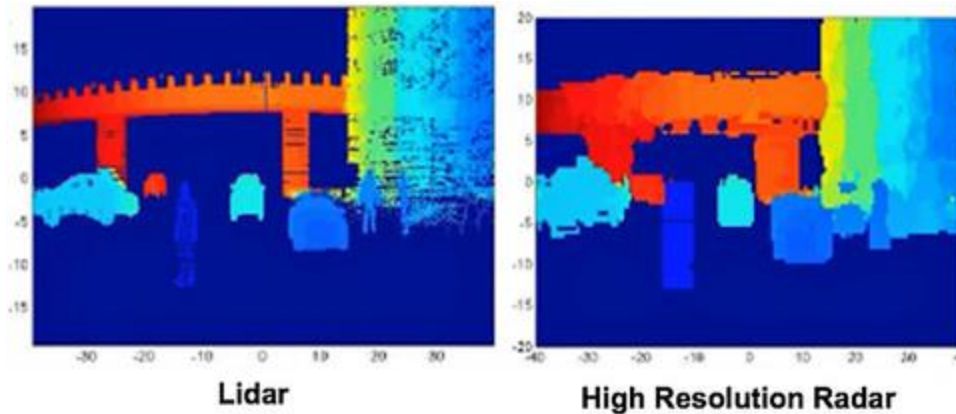




# ROBOT ERRORS



## Imperfect sensing



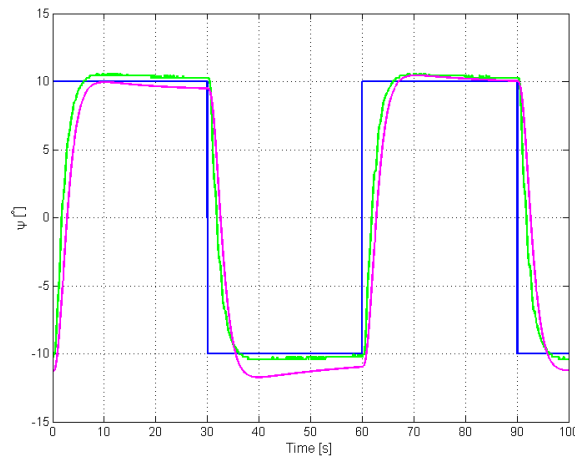
<https://www.fierceelectronics.com/components/lidar-vs-radar>

## Imperfect decision



<https://www.fastcompany.com/40568609/humans-were-to-blame-in-google-self-driving-car-crash-police-say>

## Imperfect control



[https://www.researchgate.net/publication/261058015\\_Modelling\\_of\\_nonlinear\\_helicopter\\_model\\_and\\_lo\\_opshaping\\_based\\_controller\\_synthesis/figures?lo=1&utm\\_source=google&utm\\_medium=organic](https://www.researchgate.net/publication/261058015_Modelling_of_nonlinear_helicopter_model_and_lo_opshaping_based_controller_synthesis/figures?lo=1&utm_source=google&utm_medium=organic)



# ROBOT ERRORS

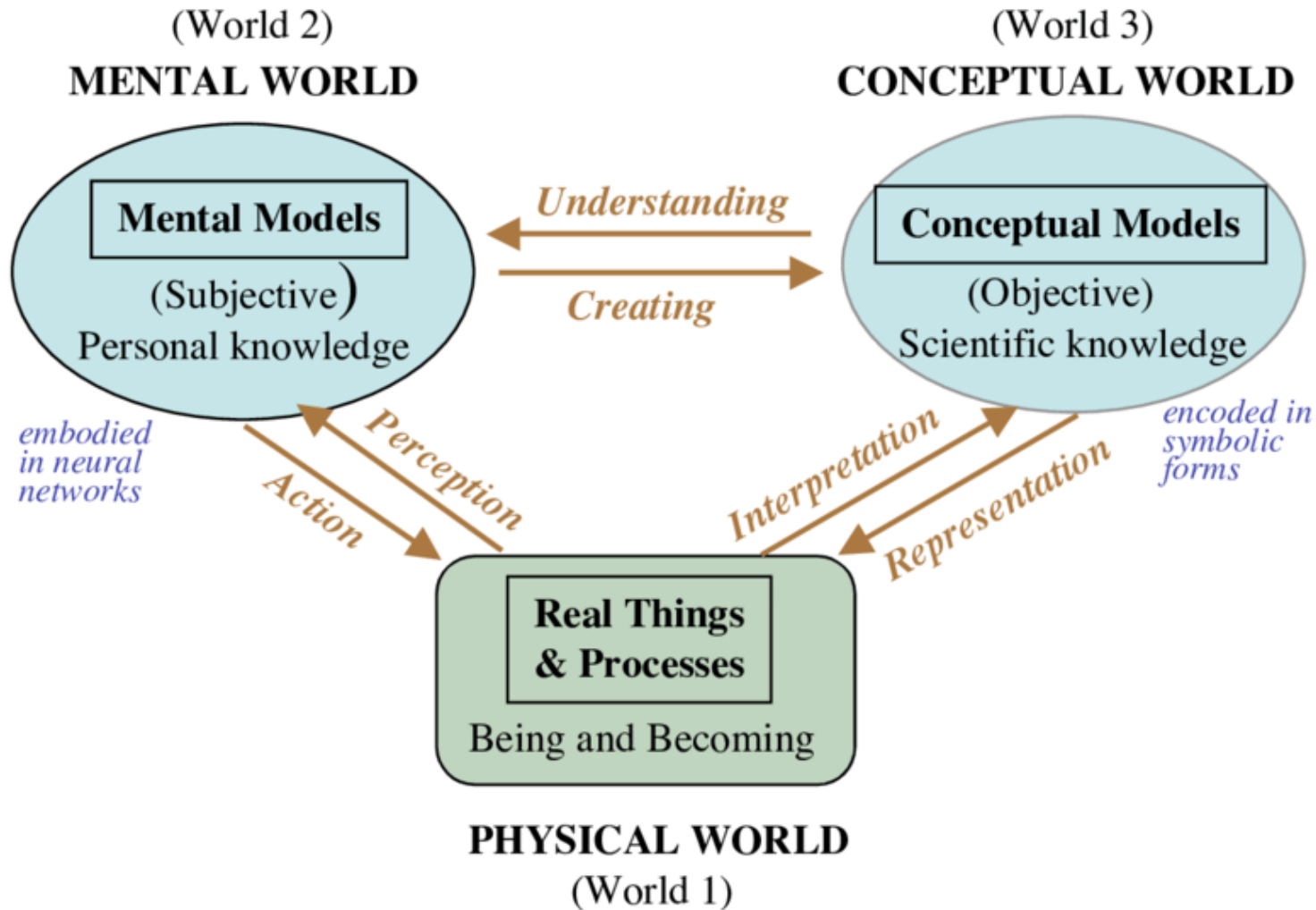


- **Imperfect Sensing:**  
**Misclassification**
- **Imperfect Decision:**  
**Erratic Behaviour**
- A Tesla's Autopilot system mistakenly identifying a horse-drawn carriage
- It recognized the carriage as a truck, a car, a human, a human walking behind a car, and a human walking behind a truck
- At one point, the system even depicted the "truck" spinning around as if it were heading for a collision with the Tesla, which could potentially lead to inappropriate or unsafe actions by the AV

<https://www.youtube.com/shorts/tpOg87AQvbo>



# Mental Models



[https://www.researchgate.net/publication/253847244\\_Notes\\_for\\_a\\_Modeling\\_Theory\\_of\\_Science\\_Cognition\\_and\\_Instruction/figures?lo=1&utm\\_source=google&utm\\_medium=organic](https://www.researchgate.net/publication/253847244_Notes_for_a_Modeling_Theory_of_Science_Cognition_and_Instruction/figures?lo=1&utm_source=google&utm_medium=organic)



Usability is a critical factor that determines how **effectively and comfortably humans can interact with robots:**

- **Useful** - accomplish the task;
  - The robot must be capable of performing the tasks it was designed for, effectively meeting the user's needs.
- **Usable** - do it easily and naturally, without danger of error, etc;
  - The robot should be easy to use, safe, and intuitive, allowing users to interact with it without frustration or difficulty.
- **Used** - make people want to use it, be attractive, engaging, fun, etc.
  - The robot should be engaging, attractive, and enjoyable to use, encouraging users to interact with it regularly and creating a positive overall user experience.



# USABILITY - ISO Standard 9241



- **Usability**: the effectiveness, efficiency and satisfaction with which specified user achieve specific goals in particular environments.
- **Effectiveness**: The accuracy and completeness with which specified users can achieve specific goals in particular environments.
- **Efficiency**: The resources expended to achieve the accuracy and complete the goal(s).
- **Satisfaction**: The comfort and acceptability of the work system to its users and affected parties



# A Historical Overview of HCI/HRI



- How can an interactive system be developed to ensure its usability?
- How can the usability of an interactive system be demonstrated or measured?
- **Design Paradigms**
  - Paradigms are practical examples believed to enhance usability of interactive systems.
- **HCI Patterns**
  - Patterns are an approach to capturing and reusing the knowledge of what made a system / paradigm successful – to apply again in new situations.

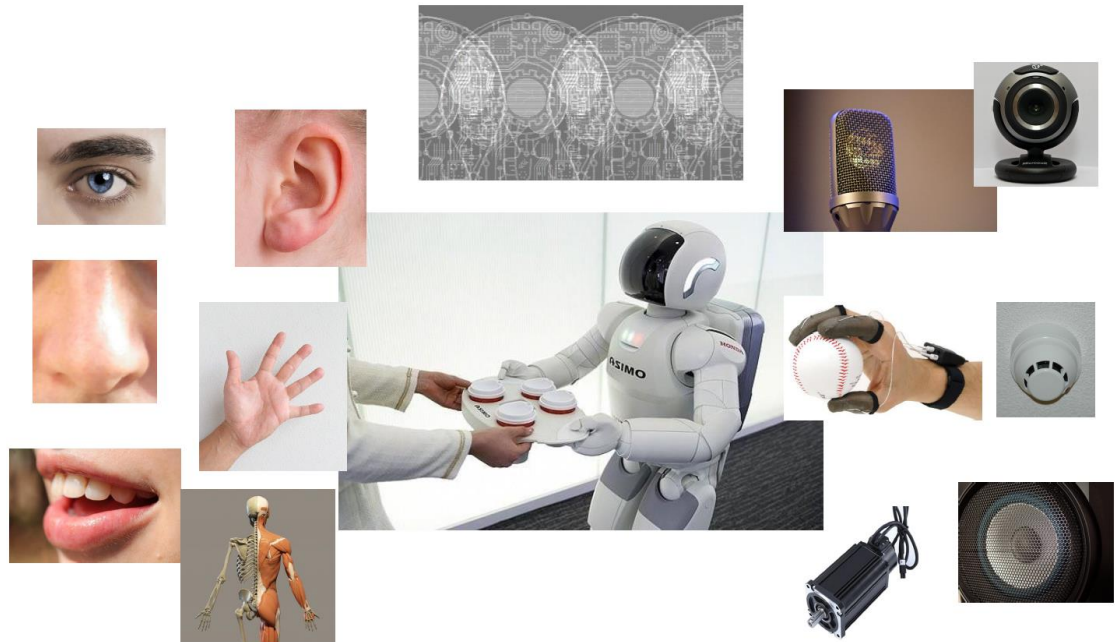




# Multi-modality

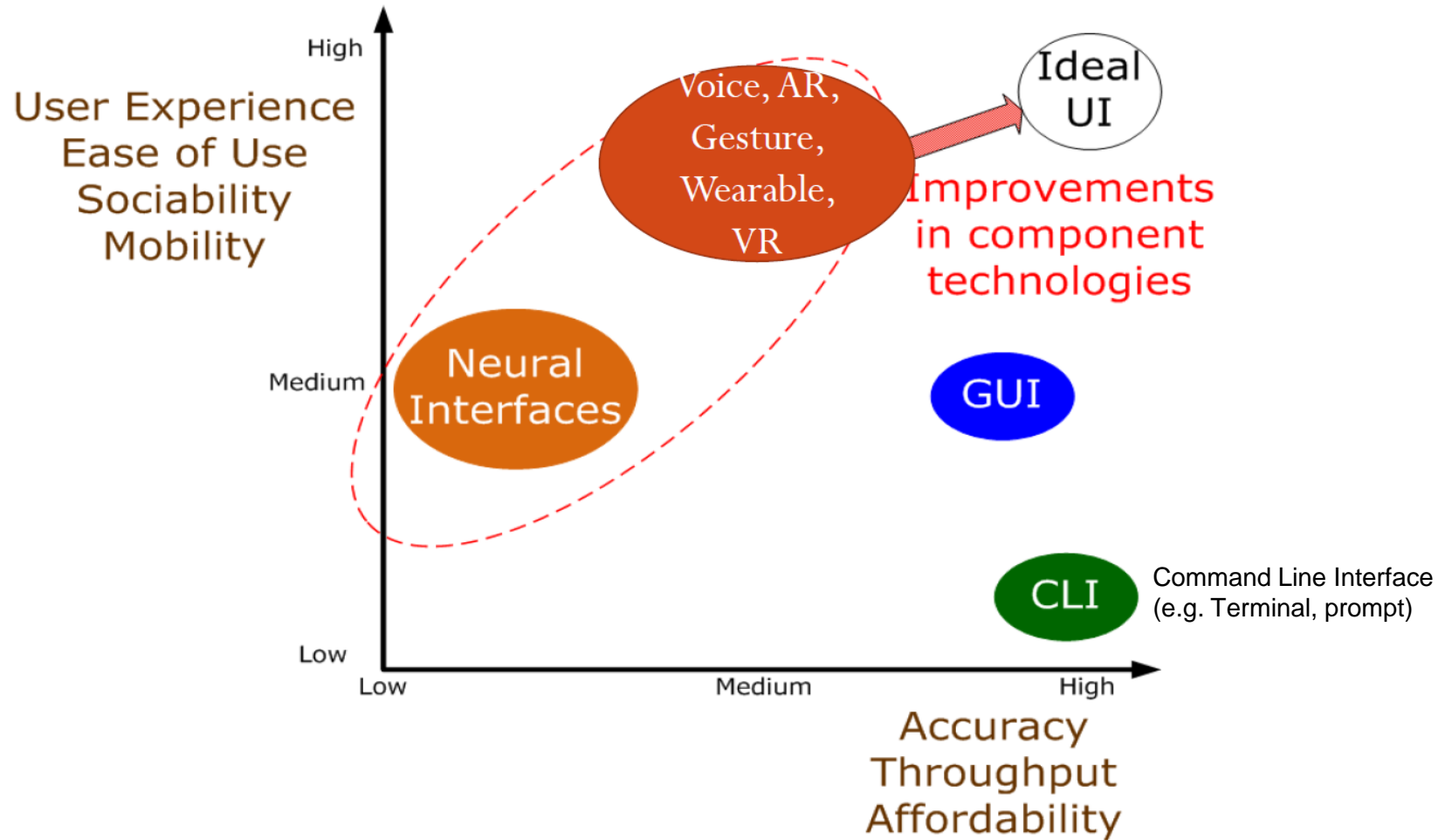


- Simultaneous use of multiple communication channels for both input and output. E.g.
  - Visual
  - Auditory
  - Tactile
  - Smell
  - Taste
  - Kinesthetic  
(body language)





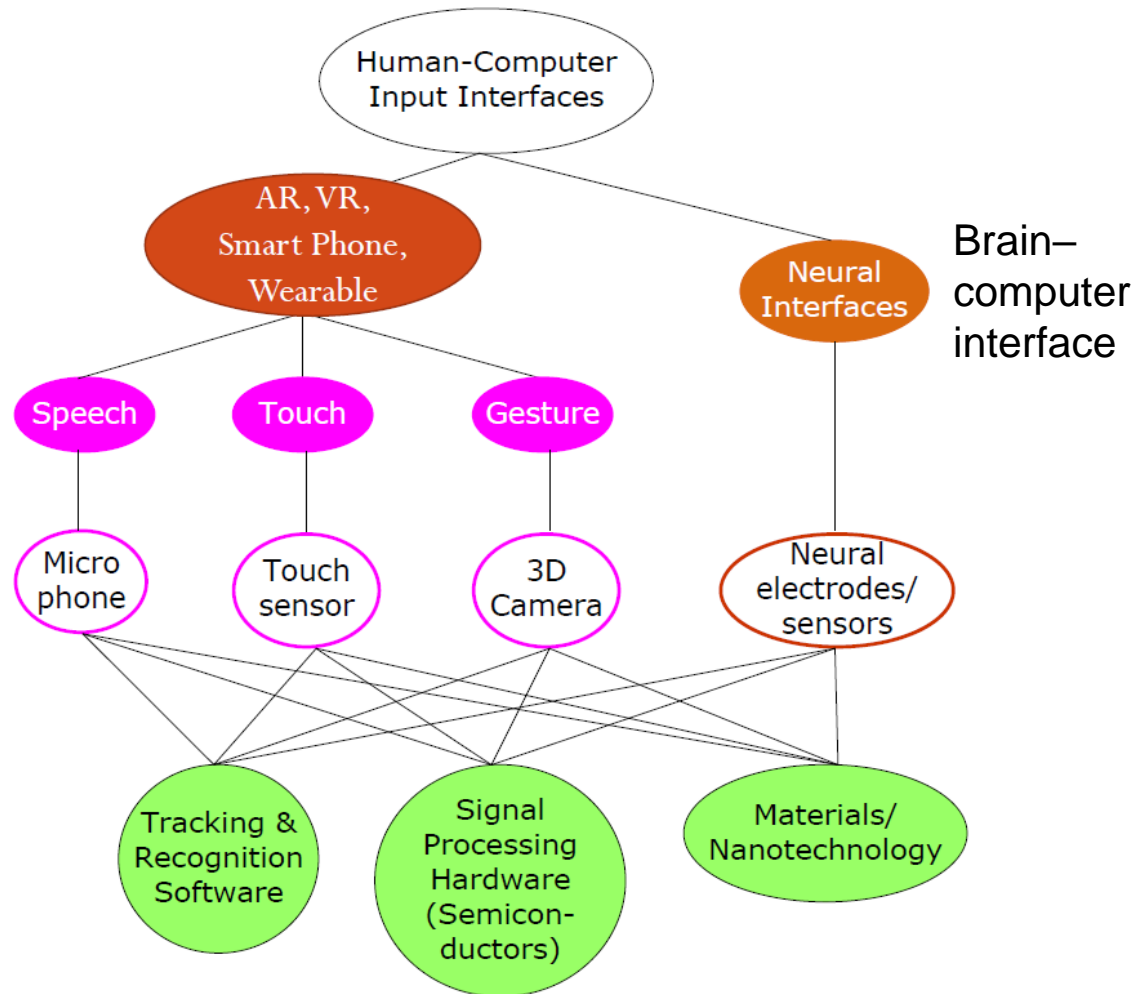
# Comparison of Input Interfaces



Source: Human-Computer Interfaces and Wearable Computing. Jeffrey Funk. MT5009 - Analyzing Hi-Technology Opportunities.



# Key Components of Input Interfaces



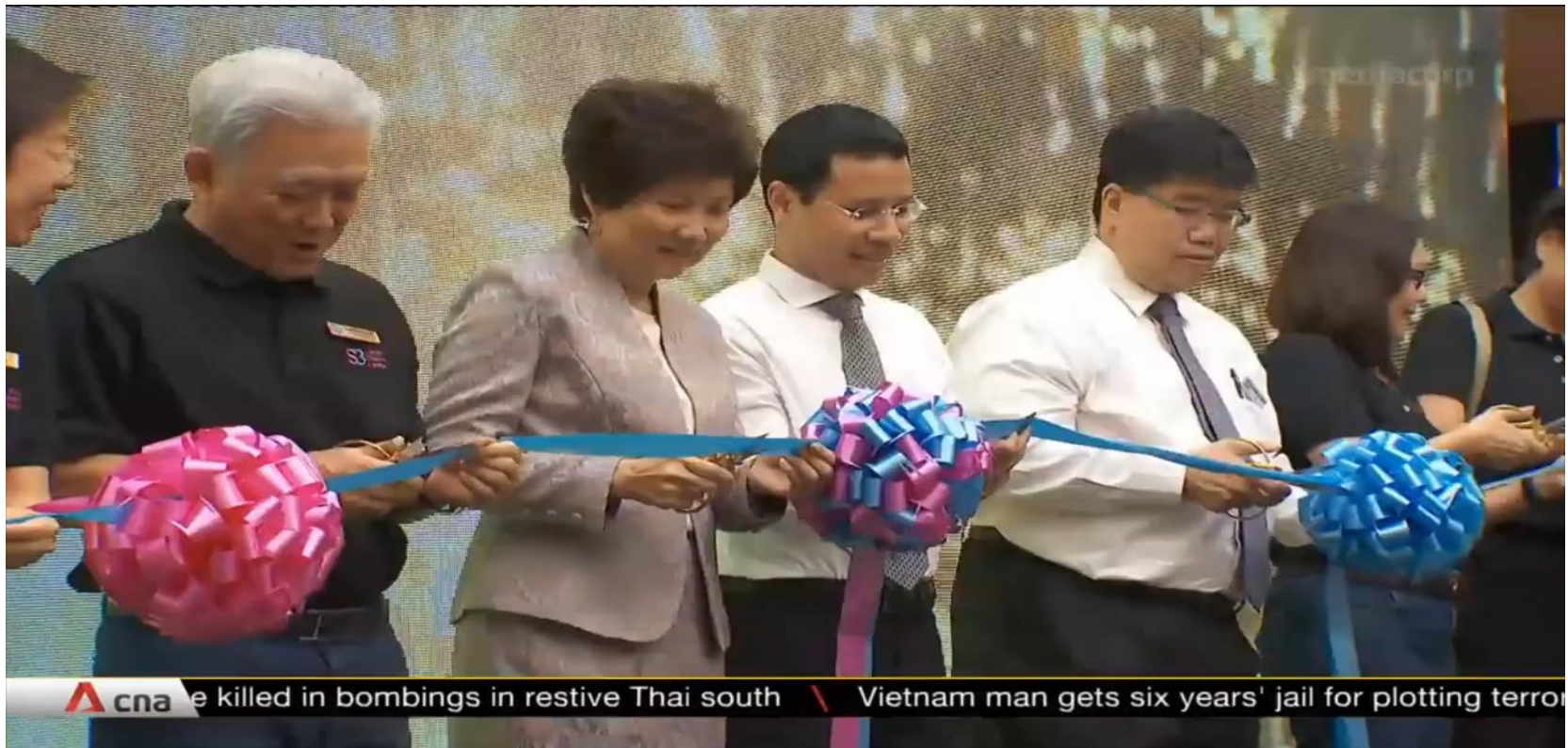
Source: Human-Computer Interfaces and Wearable Computing. Jeffrey Funk.  
MT5009 - Analyzing Hi-Technology Opportunities.



# Our NUS-ISS Stroke Rehab System



- Funded by SG Enable (>\$500 K)
- Uses 3D cameras and speech for interaction



<https://www.youtube.com/watch?v=ogI6IRPEXFU>

# Neural Interface: Brain Computer Synchronization

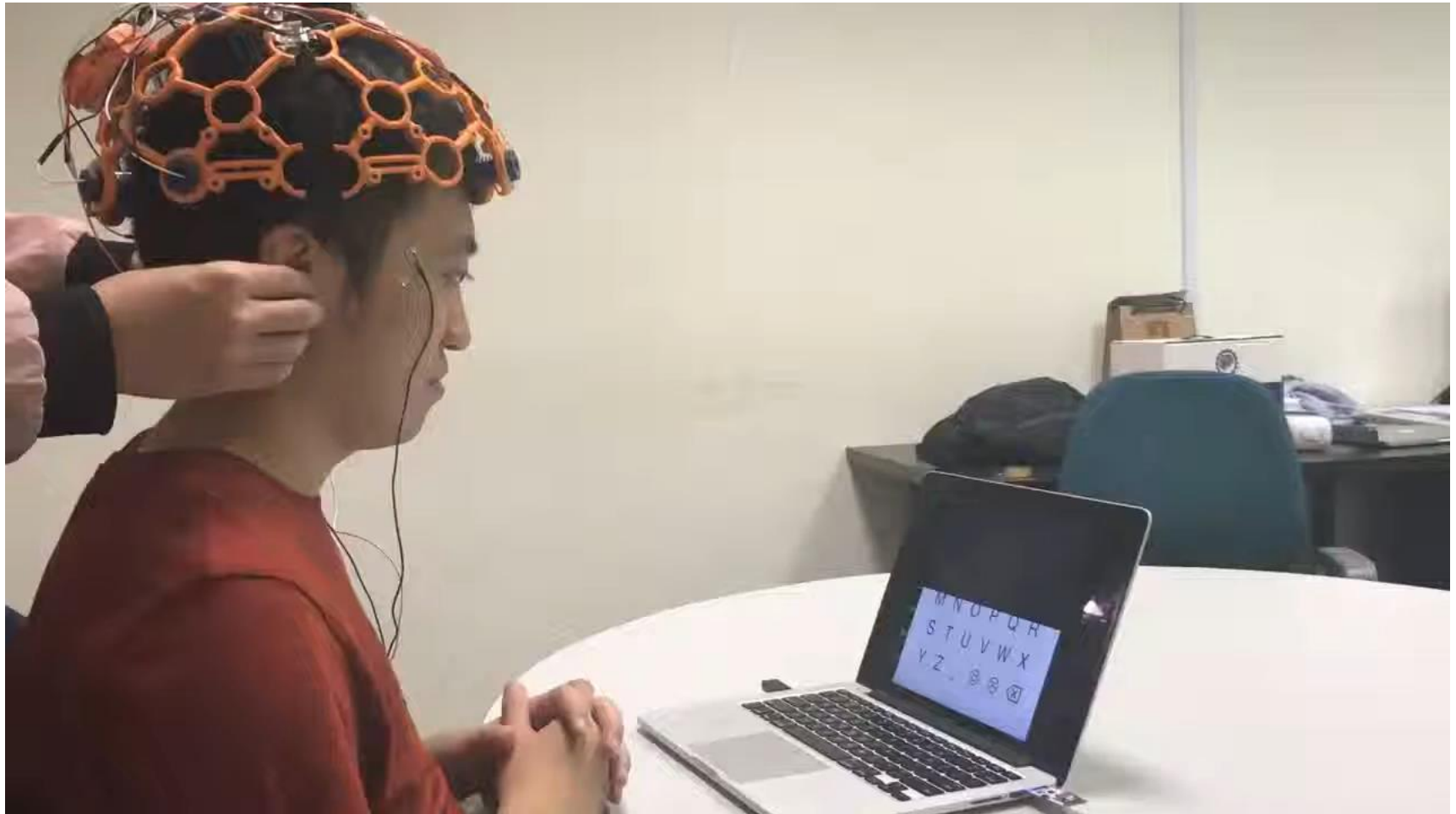
- Tools and Hardware:  
Brain scanning device
- Critical factors are  
Accuracy, Throughput  
and Affordability
- Currently limited  
accuracy – plasticity  
of brain
- Costs a deterrent  
factor
- **Mind-Controlled  
Drones Example  
(Video on the Right)**



<https://www.youtube.com/shorts/QmNzUkDNoDc>



# Our NUS-ISS EEG System for LIS Patients



[https://www.youtube.com/watch?v=e0-nev\\_pEQs](https://www.youtube.com/watch?v=e0-nev_pEQs)





# Effects of Design in HRI



Design can affect 5 attributes of HRI:

1. Level and behavior of **autonomy**

- The design impacts how much control the robot has vs the human, influencing the dynamics of shared decision-making and trust in HRI.

2. Nature of **information exchange**

- The design determines the effectiveness of communication channels between humans and robots, affecting understanding, responsiveness, and seamless interaction.

3. **Structure of the teams**

- The design defines the roles and integration of humans and robots in a team, shaping collaboration, workload distribution, and interaction patterns.

4. **Adaptation, learning and training** of people and the robot

- The design affects how both humans and robots can learn from each other and adjust their behaviors, enhancing mutual understanding and interaction quality.

5. **Shape of the task**

- The design influences how tasks are defined and allocated between humans and robots, shaping the interaction flow and the complexity of joint task execution.



# 1. Autonomy



- Autonomy is not an end in itself in HRI, but a mean to supporting productive interaction
- Continuum of autonomy:
  - Computer offers no assistance; human does it all
  - Computer offers a complete set of action alternatives
  - Computer narrows the selection down to a few choices
  - Computer suggests a single action
  - Computer executes that action if human approves
  - Computer allows the human limited time to veto before automatic execution
  - Computer executes automatically then necessarily informs the human
  - Computer informs human after automatic execution only if human asks
  - Computer informs human after automatic execution only if it decides to
  - Computer decides everything and acts autonomously, ignoring the human

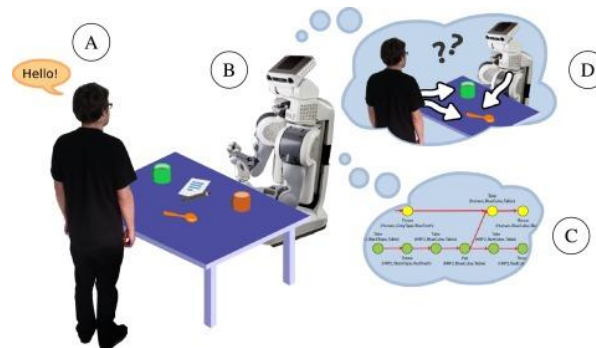




## 2. Information Exchange



- Efficient interactions are characterized by **productive exchanges** between human and robot
- **Measures of the efficiency:**
  - Time required for intent and/or instructions to be communicated
  - Cognitive or mental workload of an interaction
  - Amount of situation awareness produced by the interaction
  - Amount of shared understanding or common ground





### 3. Structure of Teams



- How many remote robots a single human can manage?
- Dependent on:
  - Level of autonomy of the robot (teleoperation and remote control requires vastly more direct attention from the human)
  - The task (which defines the load)
  - The available modes of communication (e.g. voice commands, visual/haptic feedback; these may hinder multi-robots management)
- Need for design of intelligent control interface between humans and multiple robots



# 4. Adaptation, Learning, and Training



## 1. Minimizing Operator Training

- Design **interfaces and control systems** that are intuitive and user-friendly to reduce the time and effort required for operators to learn how to effectively manage and interact with robots.

## 2. Efforts to Train Humans

- Comprehensive **training programs** that focus on enhancing operators' understanding of robot capabilities, limitations, and interaction protocols to ensure safe and effective human-robot collaboration.

## 3. Training Designers

- Educate robot and system designers on **human factors, usability principles, and the specific needs of end-users** to create more effective, user-centered robot interfaces and interaction models.

## 4. Training Robots

- Implement adaptive algorithms and learning techniques that enable robots to **learn from human interactions and experiences**, improving their performance, autonomy, and ability to collaborate with humans over time.



## 5. Task-Shaping



- Introducing technology fundamentally changes the way that humans do the task
- **Task-shaping** emphasizes the importance of considering how the task should be done and will be done when new technology is introduced

### **Examples of explicit task-shaping include:**

- Specially designing space or underwater equipment and tools so that handles and connectors can be manipulated by a robotic arm
- “Pre-cleaning” a room so that a robot vacuum can accomplish its task most efficiently





# 5 Solution Themes of HRI



## 1. **Dynamic Autonomy, Mixed-Initiative Interaction, and Dialog**

- Interactions that **accommodate complexity**; need for robots to dynamically adjust their level of autonomy based on the complexity of tasks and the current context of interaction

## 2. **Telepresence and Information Fusion in Remote Interaction**

- Use information to **provide humans an operational presence with robot**

## 3. **Cognitive Modelling**

- Robot to **adjust information exchange according to human's cognitive state** (e.g. voice, visual, mixture of both)
- **Generate robot's behaviour with models that are interpretable by humans** (e.g. natural body languages, gestures)

## 4. **Team Organizations and Dynamics**

- **Cooperation between humans and robots in teams**

## 5. **Interactive Learning**

- **Human and robots can learn from one another via actions and/or feedback** to incrementally improve ability, autonomy and interaction; enables robots to improve their skills, autonomy, and interaction strategies over time, and enables humans to learn how to better communicate and collaborate with robots

## 1. Who is the design for?

- Understanding the target users is crucial; consider their needs and preferences

## 2. Why do they want it?

- Purpose and goals of the HRI system

## 3. What are the materials required?

- Necessary hardware and software components required for the system development

## 4. What is the cost?

- Includes development, deployment and maintenance costs

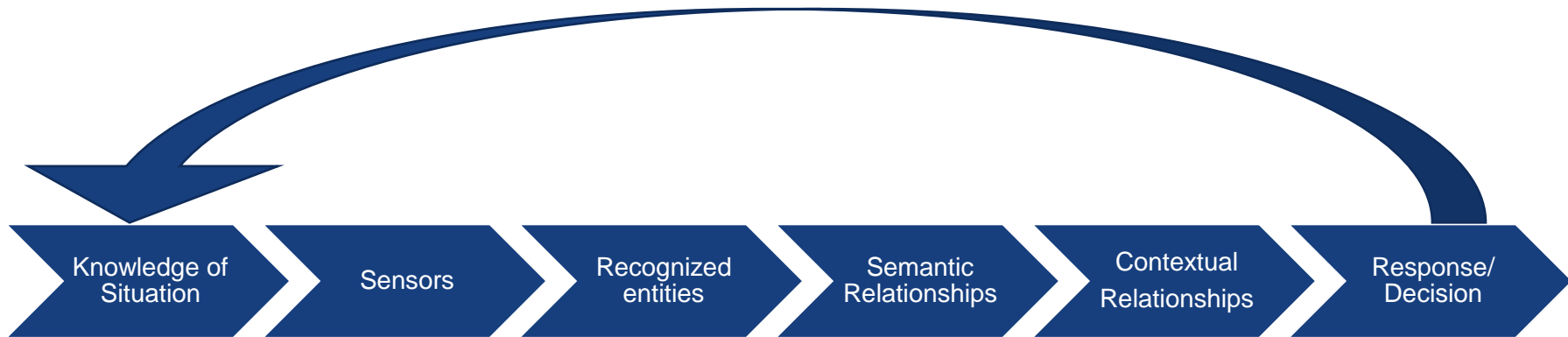
## 5. What are the safety/ethical issues?

- Ensures that the HRI system is reliable, secure, and respects user privacy and rights

| Type of Human Factor Engineering (HFE)  | Examples of Principles  | Examples of Design   |
|---|---|--|
| <b>Physical HFE</b><br>- concerned with <b>human anatomical, anthropometric, physiological and biomechanical characteristics as they relate to physical activity</b>  | <ul style="list-style-type: none"> <li>Minimize time required for perception, decision, and manipulation</li> <li>Reduce or mitigate need for physical intervention</li> <li>Optimize opportunities for physical movement</li> </ul>  | <ul style="list-style-type: none"> <li>ML to learn user preference</li> <li>Auto-suggest based on initial few inputs</li> <li>Voice or gesture inputs</li> <li>Auto-highlight important information</li> <li>Hardware repair/repositioning</li> <li>Replacement of traditional keyboard and mouse with touchpad input devices to compensate limited workspace</li> </ul> |
| <b>Cognitive HFE</b><br>- concerned with <b>mental processes, such as perception, memory, reasoning, and motor response</b> , as they affect interactions among humans and other elements of a system   | <ul style="list-style-type: none"> <li>Consistency of interface design</li> <li>Match technology and user's mental model</li> <li>Minimize cognitive load</li> <li>Allow for error detection and recovery</li> <li>Provide feedback to users</li> </ul>                               | <ul style="list-style-type: none"> <li>Active feedback on user's action based on sensors</li> <li>Gamification elements to reduce boredom</li> <li>ML to learn preference or gestures</li> <li>NLP</li> <li>Information overlay or AI guide</li> <li>Adjustment of alarm parameter to reduce false alarms</li> </ul>   |
| <b>Organizational HFE</b><br>- concerned with the <b>optimization of sociotechnical systems</b> , including their organizational structures, policies, and processes<br>- <b>attainment of a fully harmonized work system</b> that ensures employee job satisfaction and commitment<br>- Include <b>employee's communication, participation and cooperation with the system</b> | <ul style="list-style-type: none"> <li>Provide opportunities to users to learn and develop new skills (<i>Meaningfulness of tasks</i>)</li> <li>Allow user control over work systems</li> <li>Support user access to social support</li> <li>Involve user in system design</li> </ul> | <ul style="list-style-type: none"> <li>Feedback from users to improve systems</li> <li>Settings to configure layout/functions</li> <li>Live help-desk operator (the user is human after all!)</li> <li>Increase user awareness and understanding of the system; Virtual or augmented reality technologies can be utilized to enhance this</li> </ul>                     |



# Design Process for Human-Robot Interaction



- **Knowledge of Situation:** Broad theme of what do you want the system to understand and do in the situation (based on various scenarios and contexts)
- **Sensors:** Types of hardware sensors to be used
- **Recognized entities:** 1<sup>st</sup> layer of feature groupings to yield specific recognized entities
- **Semantic Relationships:** 2<sup>nd</sup> layer of recognized entities groupings to yield specific semantic relationships
- **Contextual Relationships:** 3<sup>rd</sup> layer of Semantic Relationship groupings to yield specific contextual relationships
- **Decision/Actuation**



# Applied Example



Robotic nurse, Tommy, in Italian hospital that cares for Covid-19 patients under quarantine

<https://www.pri.org/stories/2020-04-08/tommy-robot-nurse-helps-italian-doctors-care-covid-19-patients>





# Case Study Example:

## HRI Design Considerations for Covid-19 Robot



- **Who is the design for?**
  - Covid-19 patients and hospital staff
- **Why do they want it?**
  - To reduce interaction between staff and patients and to automate as much of the monitoring and caregiving as possible
- **What are the materials required?**
  - Mobile robot with on-board sensors (for monitoring vitals like blood pressure and oxygen saturation), a tablet for communication, a microphone, speakers, and a camera for video communication
- **What is the cost?**
  - Approx 100,000 Euros per unit
- **What are the safety/ethical issues?**
  - Wrong diagnostics, over-reliance on automation, patient acceptance and psychological impact, data privacy



# Case Study Example:

## HFE Design for Covid-19 Robot



| Type of HFE               | Design   |
|---------------------------|--|
| <b>Physical HFE</b>       | <ul style="list-style-type: none"><li>• Voice and gesture inputs and outputs for easier interaction between robots and patients</li><li>• Distance sensors required to do SLAM and to avoid collision</li><li>• IMU, heart rate, SpO2, infrared thermometer sensors to monitor patients' activities and vitals</li></ul>   |
| <b>Cognitive HFE</b>      | <ul style="list-style-type: none"><li>• Very simple instructions provided to patients</li><li>• Alarm parameter changed to IoT-based as on-site alarms can disturb patients' rest (too noisy or too bright)</li><li>• Active feedback on user's actions based on sensors (due to e.g. patients not resting enough or not drinking enough water or eating too much heavy food)</li></ul>  |
| <b>Organizational HFE</b> | <ul style="list-style-type: none"><li>• Feedback from users to improve robot services (can come in touch screen with 3 emoticons to choose from, similar to feedback systems for some toilets)</li><li>• Live help-desk operator available to address patients' concerns (e.g. suspected wrong medicine given by robot)</li><li>• Increase user awareness and understanding of the system (e.g. via emails/apps, or providing a leaflet with summarized info on the service robot)</li></ul> |



# Case Study Example:

## HRI Design Process for Covid-19 Robot



### Knowledge of Situation

Level of Activity and Vitals  
in Patients

### Sensors

4 Inertia Measurement Units

Heart Rate Sensor

SpO2 sensor

Infrared Thermometer



# Case Study Example: Covid-19 Robot



## Sensors

3 Axis IMU Sensor

3 Axis IMU Sensor

Heart Rate

SpO2 data

Temperature

## Recognized Entities

- Fast Repetitive Motion of Legs
- Slow Repetitive Motion of Legs
- Slow Non-Repetitive Motion of Legs
- Static
- Fast Repetitive Motion of Hands
- Slow Repetitive Motion of Hands
- Slow Non-Repetitive Motion of Hands
- Static
- Above Resting
- At Resting
- Above Resting
- At Resting
- High temperature
- Low temperature



# Case Study Example: Covid-19 Robot

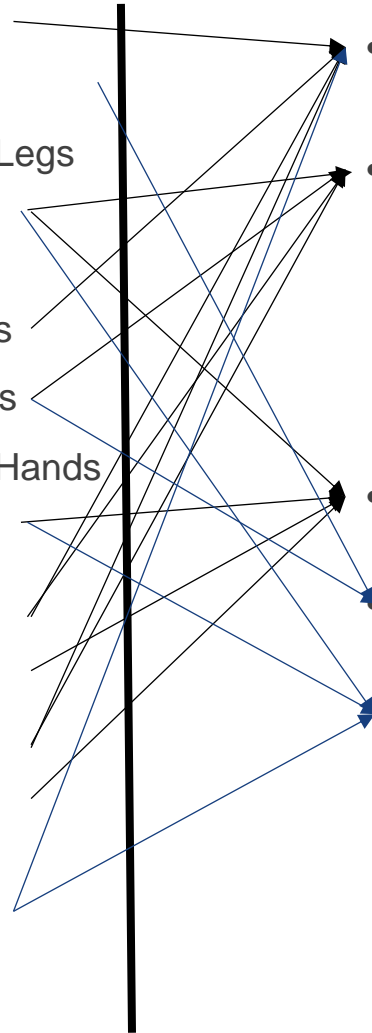


## Recognized Entities

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- Slow Repetitive Motion of Hands
- Slow Non-Repetitive Motion of Hands
- Static
- Above Resting
- At Resting
- Above Resting
- At Resting
- High temperature
- Low temperature

## Semantic Relationships

- Vigorous Activity
- Static Exercises (Pushups/situps)
- Sleeping
- Walking
- Not moving with poor vitals







# Case Study Example: Covid-19 Robot

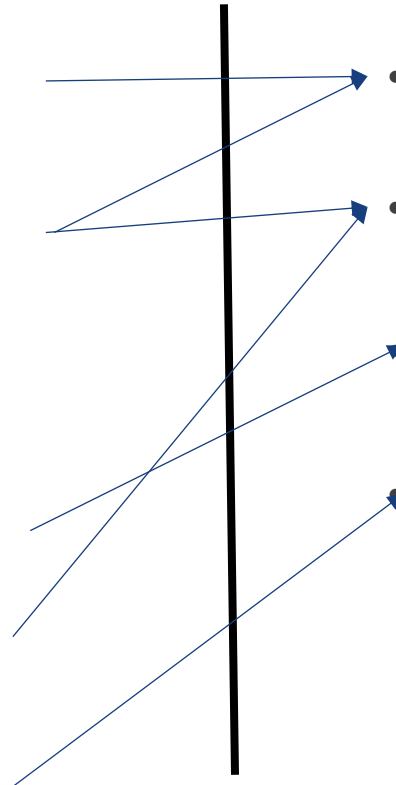


## Semantic Relationships

- Vigorous Activity
- Static Exercises (Pushups/situps)
- Sleeping
- Walking
- Not moving with poor vitals

## Contextual

- Patient is over exerting
- Patient is healthy
- Patient is too sedentary
- Patient is in distress





# Case Study Example: Covid-19 Robot



## Contextual

- Patient is over exerting
- Patient is healthy
- Patient is too sedentary
- Patient is in distress

## Decision/Response

- Broadcast advice to patient to reduce activity
- No action
- Broadcast advice to patient to be more active
- Perform emergency intervention



# Application Project



- **Think of a robotic system application** in your company or future business **that requires HRI design**
- Apply **a detailed design consideration and HRI design process** for your application
- **To be presented and submitted on the 4th day**
- **10 minutes presentation** (around 10 slides) and 5 minutes Q&A per person
- Have more graphics/charts/figures than wordy
- PowerPoint-based (use provided template: **“HRSE M1 Presentation template”**)



# Module 1

# Quiz Exercise



# End of Module 1