Challenges and Applications

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Robotics (the usual thought)



Photo Credit: Disruption Hub





Da Vinci Surgical Robot Photo Credit: Jewish General Hospital



Amazon Warehouse Robots

Platforms

Photo Credit: gifs.com



First Tech Challenge Robot Competition Photo Credit: EditiaDeDimineata.ro

Photo Credit: Boston Dynamics

SpotMini

Robotics (the usual thought)

ISO definition: "reprogrammable, multifunctional manipulator designed to move material, parts, tools or specialized devices through variable programmed motions for performance of a variety of tasks."

Wikipedia definition: "A robot is a machine—especially one programmable by a computer—capable of carrying out a complex series of actions automatically. A robot can be guided by an external control device, or the control may be embedded within. Robots may be constructed to evoke human form, but most robots are task-performing machines, designed with an emphasis on stark functionality, rather than expressive aesthetics."

Assistive Robotics - an umbrella term

Defining characteristics of *assistive robots*:

- Work alongside / in assistance of humans => direct interaction with humans
- Can perceive their environment and **other individuals** using sensors and intelligent algorithms
- Can **communicate with people** multimodally
- Can have a degree of autonomy for navigation, decision making
- Have a strong focus on **safety of the interaction**

Assistive Robotics - when viewed as collaboration

COBOTS (collaborative robots)

Wikipedia definition: "A cobot, or collaborative robot, is a robot intended for direct human robot interaction within a shared space, or where humans and robots are in close proximity. Cobot applications contrast with traditional industrial robot applications in which robots are isolated from human contact."

Assistive Robotics - when viewed as *collaboration*



Kuka Robotic Arm Photo Credit: RobotWorx - Collaborative robot safety



Baxter Robot Photo Credit: NS Medical Devices

Assistive Robotics - the more common understanding

• An **assistive robot** performs a **physical task** for the **well-being** of a **senior person / person with disabilities.** The **task** is usually in the context of **Activities of Daily Living**.

• The **person** is in control of the robot (=> no autonomy)

Assistive Robotics - the more common understanding



HAL (Hybrid Assistive Limb) by Cyberdyne Photo Credit: roboticsfinder.com



JACO Assistive Robot Arm by Kinova Robotics Photo Credit: kinovarobotics.com



Sophia by Hanson Robotics Photo Credit: hansonrobotics.com



Sophia by Hanson Robotics Photo Credit: hansonrobotics.com



Paro by Paro Robotics Photo Credit: parorobot.com



Sophia by Hanson Robotics Photo Credit: hansonrobotics.com



Paro by Paro Robotics Photo Credit: parorobot.com



Pepper by Softbank Photo Credit: softbankrobotics.com Nao by Softbank Photo Credit: softbankrobotics.com



Sophia by Hanson Robotics Photo Credit: hansonrobotics.com



Paro by Paro Robotics Photo Credit: parorobot.com



Amazon Echo



Digital Assistants (robots require embodiment)



Pepper by Softbank Photo Credit: softbankrobotics.com Nao by Softbank Photo Credit: softbankrobotics.com

Social Robotics - Domains of Activity

• Healthcare and Active and Assisted Living

- Assist aging or disabled individuals who are in need of *supervision* (but not active care)
 - This includes companion robots with manipulation capabilities, but is mostly focused on communication capabilities and facilitation of tele interactions
- Emotional assistance
 - Mostly "pet" robots → based on pet-therapy in hospitals or care facilities
- Therapy for people with Autism Spectrum Disorder
 - Robots have non-humanoid, humanoid (e.g. Nao) or animal-like form
 - Robots help in addressing and practicing social behaviors (e.g. eye contact, touch, liking), language development, stereotyped behaviors
- Why use robots in Healthcare and Assisted Living?
 - Many elderly users live alone
 - Time constraints for quality care on both formal and informal caregivers
 - Cost-savings (given the lack of sufficient care workers and growing aging population)

Social Robotics - Domains of Activity

• Education

- Focused mostly on tutoring and teaching for children (age groups 3-12)
- Research focuses on both *cognitive (e.g. learning gains, improved test completion times)* and *affective* learning outcomes (e.g. improving attention, fatigue measurement, engagement measurement, anxiety reduction)
- Examples:
 - learning a game (e.g. chess)
 - learning a foreign language (e.g. english for japanese students including *robot as novice* setup)
 - tutoring during puzzle games
 - Handwriting improvement (*teachable robot*)
- Why use robots in Education?
 - High availability + easy to provide fact-based knowledge
 - Increased acceptance by young users



T. Belpaeme et al. "Social robots for education: A review." *Science robotics* 3, no. 21 (2018)

 Studies begin showing positive effects when compared to just computer-based tutors (effect of "embodiment")

Social Robotics - Domains of Activity

• Public Assistance and Entertainment

- Social Robots as "public info points", "waiters" and "performers" at various events and public interest institutions / venues (hotels, business centers, banks, restaurants)
- Includes entertainment in social care scenarios (e.g. games / quizzes for the elderly)

- Why use robots in Entertainment?
 - High availability
 - Novelty factor







Social Robotics - how researchers define it

"Social robots are *physically embodied agents* that have *some (or full) autonomy* and engage in *social interactions with humans*, by *communicating*, *cooperating*, and *making decisions*. These *behaviours* are then *interpreted* by human onlookers as *'social'*, according to current norms and conventions." [1]

Social Robotics - what users expect of it

Being accepted as a **social entity** in a user home requires [2]:

- 1. **Two-way interaction** (robot has to respond to a human in a *human manner*)
- 2. Display thoughts and feelings
- 3. Be **socially aware** of their environment
- 4. Provide **social support** (be *there* for a person, like a friend)
- 5. Demonstrate **autonomy**

Social Robotics - some distilled requirements

- Embodied *agents* that are part of a *heterogenous group: humans and robots*
- Robots must perceive and interpret the world, creating their own history
- Engage in **social interactions / communicate** with humans (and other robots) following **behavioral norms**
- **Emotion modeling** (through speech, facial expressions, body language)

Social Robotics - Social Challenges :-)

- Researchers focus on *general* (navigation, people and environment perception) and *communication capabilities* (multimodal human-robot interaction)
- Users **expect** to **relate** to a social robot as they would to a **human friend**
 - The current limited social capabilities of a social robots lead humans to view them as **household servants** (rather than companions)
 - Users quickly lose interest if their **"social capabilities"** (e.g. reciprocal conversation) expectations are unmet
- Current research is **still** mostly focused on the technical challenges (**it still has to be**). The *social sciences* (psychology, user studies, behavioral science) are not yet in focus.

Social Robotics - Social Challenges :-)



The Uncanny Valley effect Photo Credit: Wikipedia

Social Robotics - Technical Challenges

- Human-oriented perception:
 - People tracking, face detection/recognition, gesture recognition, action recognition, facial expression classification
- Environment perception:
 - Navigation/Exploration, object detection/recognition, lifelong SLAM
- Interaction/Planning:
 - Realistic Dialogue Management, People Modeling, Lifelong Behavior Management

Social Robotics @ AI-MAS

Our Experience with the Pepper Robot

Active and Assisted Living

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CAMI Ecosystem

- Integrated solution to support elderly needs
- Functionalities:
 - Health data monitoring and sharing
 - Home monitoring
 - Supervised Physical Exercises
 - Intelligent Reminders and Planning
 - Multimodal Interactions







CAMI Multi-Modal Interface

- Set user preferences
- Status of the user (medical condition + reminders)
- Environment condition
- System Config



Our Work with the Pepper Robot: the AMIRO framework

Our Work with the Pepper Robot: the AMIRO framework



S. Ghiță et al. "The AMIRO Social Robotics Framework: Deployment and Evaluation on the Pepper Robot." Sensors 20, no. 24 (2020)



Localization / Map construction

 Requires use of an external 2D LiDAR (360° RP1 Lidar) + Raspberry PI3 board for LiDAR data acquisition



Localization / Map construction

- Requires use of an external 2D LiDAR (360° RP1 Lidar) + Raspberry PI3 board for LiDAR data acquisition
- Hector SLAM [3] for environment mapping
- **Fine-tuned** *amcl* ROS module [4] for localization (fine tuning looks at the physical / geometrical constraints of the robot - e.g. maximum translation and turn speed, move base footprint, safety margins)

[3] <u>http://wiki.ros.org/hector_slam</u>
[4] <u>http://wiki.ros.org/amcl</u>



Localization / Map construction

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- Hector SLAM [3] for environment mapping
- **Fine-tuned** *amcl* ROS module [4] for localization
- External LiDAR required for large scale SLAM-based mapping (e.g. lab + floor) range sensors of Pepper robot have too limited a range

[3] <u>http://wiki.ros.org/hector_slam</u>
[4] <u>http://wiki.ros.org/amcl</u>





Navigation using existing map

- Uses the *move_base* ROS module, using DWA local planner and A* global planner
- Pepper robot has large orientation errors on rotation (10° on every 360° turn) + drift on translation (1° on every meter forward) => external LiDAR still required for correct localization
- Global Planner configured to plan for 5m movements at a time: e.g. navigation from lab to hallway for 18.2m takes 58.11s to execute

Environment Perception in AMIRO: Object Detection



- Use of YOLOv3 [5] model for object detection
- Tracking of objects (including identified people) using the SORT [6] algorithm
- Use of an object segmentation algorithm
 [7] to *align* object pixels with robot
 depth-map => can estimate **distance to**objects

Human-Centered Perception in AMIRO

Human-Centered Perception in AMIRO





- **Person** *Detection* using YOLOv3 [5]
- Tracking of people using the SORT [6] algorithm
- **Person** *Recognition* using FaceNet [8]
- Pose Recognition using Openpose [9]

[5] Redmon, Joseph, and Ali Farhadi. "Yolov3: An incremental improvement." (2018).

[6] A. Bewley et al., "Simple online and realtime tracking," ICIP 2016

[8] F. Schroff et al.,, "Facenet: A unified embedding for face recognition and clustering", CoRR, 2015

[9] Z. Cao et al. "Realtime multi-person 2d pose estimation using part affinity fields.", ICCV, 2017.

Human-Centered Perception: People Localization



a). Map of the environment

b). Detections in RGB image.



 AMIRO Framework combines information from Person Identification, Depth Mapping + amcl Localization services to save *last seen* position of recognized people on the map

c). Detected people placed on the map.
Human-Centered Perception in AMIRO - Vision Pipeline



• Entire processing pipeline (object det. + people det. + people/object tracking + people rec. + pose estimation) yields a 3 fps throughput

Human-Centered Perception: Action Recognition



• The Action Recognition module allows recognizing common human ADL actions such as: walking, standing, sitting, drinking, typing, pointing etc.

Human-Centered Perception: Action Recognition

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		Pred Action 2 Loss 2	Linear (256) I Pred Action 3

- The Action Recognition module allows recognizing common human ADL actions such as: walking, standing, sitting, drinking, typing, pointing etc.
- Module uses an in-house action recognition model based on human *"skeleton"* data (model pre-trained on NTU RGB+D dataset [9]

Interaction / Planning in AMIRO: Dialogue Management

NLU Input (user's command ASR result): Display my blood pressure.

NLU Output (partial):

```
"intent": "get_health",
   "entities":
   {
        "health_entity": "blood pressure",
        " output_entity ": "display"
   }
....
```

Story 1 (story name)

* greet (recognized intent)

- utter_greet (system answer/action)

* get_health (recognized intent)

- utter_health (system answer/action)

* goodbye (recognized intent)

- utter_goodbye (system answer/action)



- Dialogue Management in AMIRO uses services for each step in a conversation:
 - Local processing to **detect utterance** (active listening on microphone)
 - Google Cloud Speech Recognition API [10] for **Speech-to-Text** (works for English and Romanian)
 - Wit.ai [11] to perform Natural Language Understanding (NLU) → recognize speaker intent
 - RASA [12] for **conversation** management

[10] <u>https://cloud.google.com/speech-to-text</u>
[11] <u>https://wit.ai/</u>
[12] <u>https://rasa.com/</u>

Interaction / Planning in AMIRO: Behavior Management



- Behavior Management is implemented using a priority-queue based task manager (works like a preemptable state machine)
 - Tasks have *success* and *failure* continuations
 - Tasks can be paused (when a higher priority task is inserted into the queue)

AMIRO in Action

AMIRO in Action: Find a Person + Recognize Action



AMIRO in Action: Notification Reminders



AMIRO in Action: Putting it all together



AMIRO on Pepper: the challenges behind the scenes

- Vision Modules (people detection, action recognition) **highly** dependent on lighting conditions and camera position
- Noisy robot microphone; it's a challenge to have a group of people interact with the robot
- Continual life cycle still an ongoing challenge
 - AMIRO allows chaining together interaction episodes, but a "global" robot behavior is still missing
- Robot navigation requires "special" arrangements (sufficient distance from obstacles more than 30cm, wide open doors etc.)
- Network Bandwidth was an unexpected bottleneck :-)

AMIRO: going forward - it's still technical

- Train vision and action recognition models on a much wider set of use cases and environment conditions
- Work on implementing *single user* vs *group* interaction modes
- Augment robot navigation with lifelong SLAM and *semantic mapping*
- Extend the behavior management module to have a *default proactive* state
- More research into local vs edge vs cloud module deployments to increase re

Social Robotics

The Summary

Social Robotics: The Summary

- Social Robotics Research is most active in Healthcare/Assistance, Education and Entertainment
- Social Robotics Research is *still* dealing with the technical challenges and awaits a look into the *social* aspects
 - Social robotics requires believable capabilities of navigation, communication, environment perception, long-lived interaction to be accepted by humans
 - Currently limited to individual scenarios that can be handled well (e.g. in retail, healthcare, education)
- The large amount of required ML/AI models that need to be integrated give rise to new deployment models such as Cloud Robotics



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