Enabling Robots to Understand Natural-language Instructions for Object Manipulation



MANCHEST

A Proof of Concept Developed at the NNL Hot Robotics Facility

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Testing & Demonstration Spaces





Laser Cutting Robot Facility

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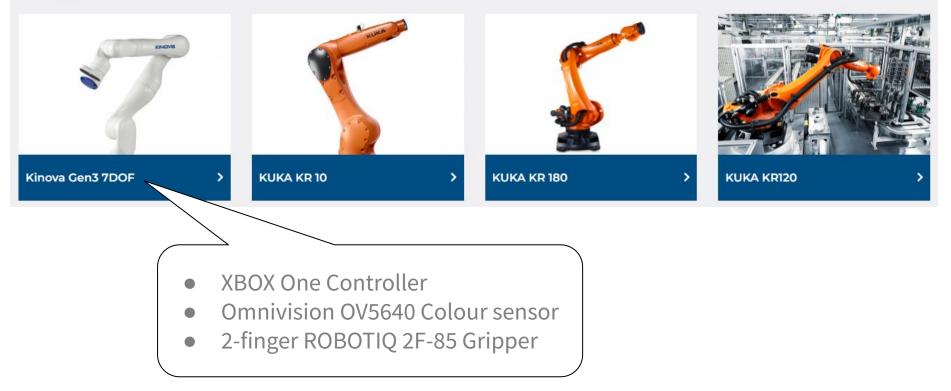
Sort and Segregation Facility



Water Dive Tank

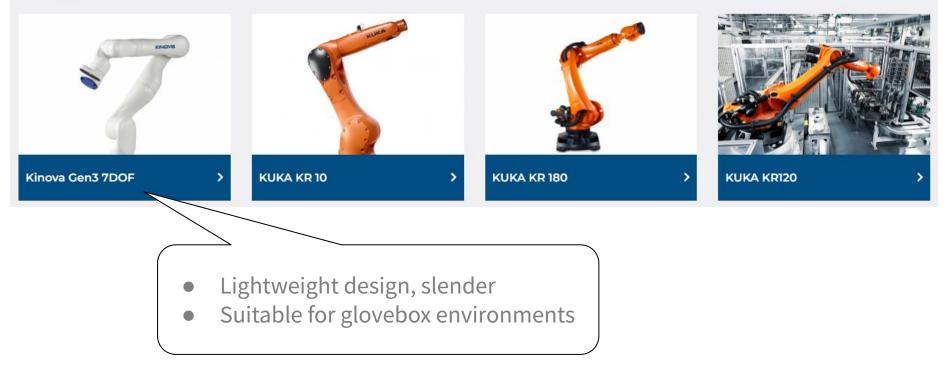
NNL Hot Robotics Facility

Manipulators



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Manipulators



Using natural language to interface with a robot

Why?

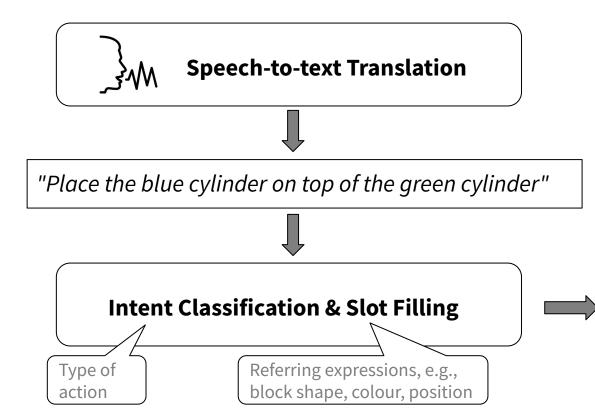
- to enable robotic systems to respond to a human operator
- could allow robot to change its behaviour as it undertakes a certain task
- reduces the need to program a robot for every task

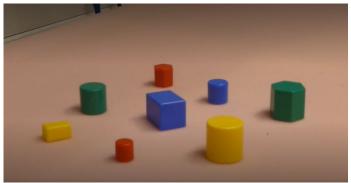
Objectives:

- 1. To equip a robotic manipulator with a natural language interface that accepts spoken, **natural language instructions**
- 2. To integrate a semantic analysis component into the manipulator, in order to:
 - understand the meaning contained within the instructions
 - visually ground *referring expressions* to the current environment
 - execute appropriate actions

Natural Language Understanding (NLU)

Proof-of-concept-system: Blocks world environment





intent: placeObject
colour: blue
shape: cylinder
target_colour: green
target_shape: cylinder
target_position: on top of

Natural Language Understanding

Speech-to-Text Translation

Implemented using **Rhasspy**¹: on-device (offline) voice assistant

Uses the **Kaldi**² engine for automatic speech recognition

Intent Recognition & Slot Filling

Implemented using **Snips**³: on-device machine learning-based engine for NLU

Model was trained on a dataset with intents and slots manually labelled

¹<u>https://rhasspy.readthedocs.io/en/latest/</u> ²<u>https://kaldi-asr.org/</u> ³<u>https://snips-nlu.readthedocs.io/en/latest/</u>



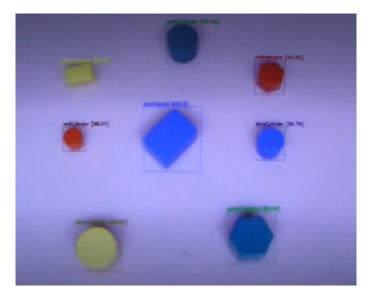
Visual Grounding

Object Recognition and Localisation

Implemented using the **YOLO**⁴ (You Only Look Once) library

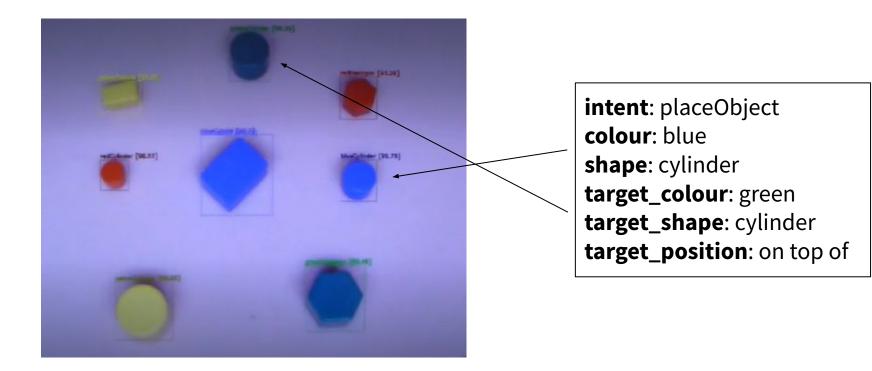
Model was trained on images with blocks annotated based on colour and shape:

redCube redCuboid redHexagon redCylinder greenCube greenCuboid greenHexagon greenCylinder blueCube blueCuboid blueHexagon blueCylinder yellowCube yellowCuboid yellowHexagon yellowCylinder



Visual Grounding

Object Recognition and Localisation



Manipulation

Planning

Real-world coordinates of the objects are calculated based on depth stream

Plan consisting of action sequence is created (based on intent and target position)

Plan executed by robot's control mechanism



Future Work and Acknowledgements

What's next?

To develop natural language interfaces to robotic manipulation systems specifically for nuclear environments

NNL Staff

Access to NNL Hot Robotics Facility at Workington for 20 days

Support from Cuebong Wong, Brendan Perry and Peter Sweetman

Any questions?

Please contact riza.batista@manchester.ac.uk

