



Aalborg Universitet

AALBORG UNIVERSITY  
DENMARK

## Technologies and Techniques for Collaborative Robotics in Architecture

*establishing a framework for human-robotic design exploration*

Jensen, Mads Brath; Das, Avishek

*Published in:*  
RE: Anthropocene

*Publication date:*  
2020

*Document Version*  
Publisher's PDF, also known as Version of record

[Link to publication from Aalborg University](#)

*Citation for published version (APA):*  
Jensen, M. B., & Das, A. (2020). Technologies and Techniques for Collaborative Robotics in Architecture: establishing a framework for human-robotic design exploration. In *RE: Anthropocene: Proceedings of the 25th International Conference of the Association for Computer-Aided Architectural Design Research in Asia (CAADRIA) 2020* (Vol. 2, pp. 292-303). Chulalongkorn University, Thailand.

### General rights

Copyright and moral rights for the publications made accessible in the public portal are retained by the authors and/or other copyright owners and it is a condition of accessing publications that users recognise and abide by the legal requirements associated with these rights.

- ? Users may download and print one copy of any publication from the public portal for the purpose of private study or research.
- ? You may not further distribute the material or use it for any profit-making activity or commercial gain
- ? You may freely distribute the URL identifying the publication in the public portal ?

### Take down policy

If you believe that this document breaches copyright please contact us at [vbn@aub.aau.dk](mailto:vbn@aub.aau.dk) providing details, and we will remove access to the work immediately and investigate your claim.

# TECHNOLOGIES AND TECHNIQUES FOR COLLABORATIVE ROBOTICS IN ARCHITECTURE

- *establishing a framework for human-robotic design exploration*

MADS BRATH JENSEN<sup>1</sup> and AVISHEK DAS<sup>2</sup>

<sup>1,2</sup>*Department of Architecture, Design and Media Technology*

<sup>1,2</sup>*{mbje|adas}@create.aau.dk*

**Abstract.** This study investigates the technological and methodological challenges in establishing an indeterministic approach to robotic fabrication that allows for a collaborative and creative design/fabrication process. The research objective enquires into how robotic processes in architecture can move from deterministic fabrication processes towards explorative and indeterministic design processes. To address this research objective, the study specifically explores how an architect and a robot can engage in a process of co-creation and co-evolution, that is enabled by a collaborative robotic arm equipped with an electric gripper and a web camera. Through a case-based experiment, of designing and constructing an adjustable façade system consisting of parallel wood lamellas, designer and robotic system co-create by means of interactive processes. The study will present and discuss the technological implementations used to construct the interactive robotic-based design process, with emphasis on the integration of visual analysis features in Grasshopper and on the benefits of establishing a state machine for interactive and creative robotic control in architecture.

**Keywords.** Design cognition; Digital fabrication; Construction; Human-computer interaction.

## 1. Introduction

The background for this work is the capacity for Industrial robotic arms to engage and change the way architects explore and fabricate novel structures and material compositions. Also, the advancement of computational design processes and CAD-related technologies have made possible the modelling, analysis and simulation of complex performance-driven constructs. The recent development of robotic arms, with their versatile and highly customizable setup, has made the fabrication of these architectural constructs feasible. In the most exceptional cases, the robotic arm is such a well-integrated aspect of the design exploration that one cannot separate the resulting design from its means of fabrication. The use of industrial robots has become a “*transformational technology in architecture*” (Daas and Wit, 2018). Despite these advancements, in

the majority of robotic-driven architectural projects, the robot, however complex tasks its performing, is following the deterministic set of commands given by the architect through a file-to-factory procedure (Pigram, Maxwell and Mcgee, 2016). This pre-planned procedure precludes the explorative element from the robotic fabrication process, as the architect has no option of intervening by re-directing or altering the fabrication process. This places the architect in the role of disengaged spectator. To successfully integrate robotic-driven design exploration the fabrication process needs to allow for human intervention and support an indeterministic search of the problem-solution space. This issue is discussed by Bryan Lawson in his seminal work on design thinking (Lawson, 2005) and later by Mary-Lou Maher who suggested a cognitive model for co-evolutionary design featuring two parallel search spaces; the problem space and the solution space (Maher, 1994). The work of Kees Dorst and Nigel Cross has also supported Maher's co-evolution model and use it to explain the behaviour found in their protocol studies of experienced designers regarding the nature of creativity in design (Dorst and Cross, 2001).

Therefore, this study investigates the technological and methodological challenges in establishing a framework for robot-based design exploration that allows for a collaborative and creative fabrication-driven design process. By taking advantage of existing methods and technological advancements in the field of computational design and architectural robotics, the study aims to establish and showcase suitable methods and procedures for connecting these fragments into a framework for design exploration with collaborative robotics.

Previous work within the field of interactive robotic-driven processes in the architectural domain already exists. Through their 'Mixed Reality Modeling' project, Johns et al. (Johns, Kilian and Foley, 2014) showcased an iterative process of robotic heat-gun melting of wax. Seeking to include "human in the loop modifications" their proposed design process allowed the designer to either manually remove wax from the physical object or to spray paint the object and thereby directly inform the robot where to perform the heat-gun treatment. The relevance of feedback loops has also been discussed by Dubor et al. (Dubor et al., 2016) who by exploring a series of case studies propose a framework for human interaction and machine response. In their paper, they conclude that 'collaboration between robots and human can enhance creativity and innovation by supporting designer and researcher while exploring complex material systems.' (Dubor et al., 2016). Similar work has been conducted by Moorman et al. (Moorman, Sabin and Liu, 2016) through the construction of a framework for dynamic robotic fabrication. Their proposed RoboSense framework seeks to promote a feedback-oriented design process where the robot shifts from being an executor of explicit commands to an "actor in a dynamic and reciprocal relationship with its fabrication environment" (Moorman, Sabin and Liu, 2016).

The projects referenced above presents exciting advancements in the construction of technological and methodological frameworks for robotic interaction in a design content and how these fabrication processes can support design exploration. At the same time, it is essential to recognize that all of the above projects work with either purely interactive processes or re-active

processes, as in the wine pouring case study in the RoboSense project. To obtain a collaborative process the robot needs to perform in a way that exceeds what can be anticipated by the designer - a robotic agent that contributes with actions and intentions that assist the human designer in exploring unknown areas and connections between a given problem-solution space.

In the field of architectural robotics, a growing range of technologies and methods are emerging, of which some hold great potential for supporting a framework for collaborative human-robot design exploration. As displayed in the diagram in Figure 1, the construction of a framework for collaborative robotic design processes requires certain key elements. While some are well described, and standard in the field of computational architecture and robot-based design, others need to be adopted from other research fields. Another important aspect for a proposed framework is the option of parallel exploration of the physical design object and its digital twin, which demands that the physical object (or system) can be reproduced for further exploration in a CAD environment.

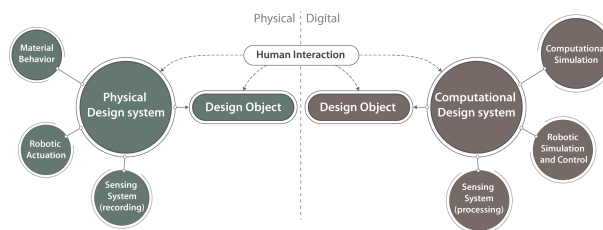


Figure 1. Framework for collaborative human-robot design exploration.

This study aims to utilize and explore the missing links needed to connect these fragments into a combined framework for design exploration with collaborative robotics. Therefore it is helpful to briefly look at the existing work for each of the key elements displayed in Figure 1.

Most of the elements needed to construct a collaborative framework already exist; however, a method for connecting and controlling all the sequential processes needs to be defined. As the behaviour of each key element is likely to pass through a series of clearly defined steps, triggered by input from either the internal processes of the system or from external user input, the concept of state machines are interesting. A state machine can be defined “*by identifying what states the system can be in, what inputs or events trigger state transitions, and how the system will behave in each state*” (Wright, 2005) and can be used to control the behaviour of simple systems, as in the example in Figure 2, or very complex UI systems. As GH is based on dataflow programming, suitable methods will have to be investigated to ‘break’ this flow and construct a customizable state machine.



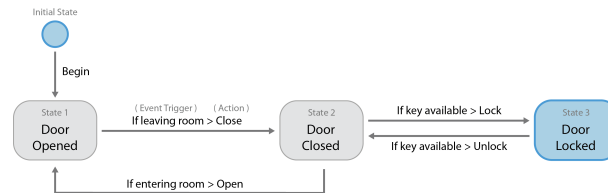


Figure 2. Example of a State Machine Diagram, with the key concepts ‘State’, ‘Event’, ‘Action’ and ‘Transition’.

The paper will present and discuss the implementations of existing technologies and methods to construct a new framework that supports a collaborative robotic-based design exploration. The paper will elaborate on the integration of visual analysis features in GH and on the benefits and challenges of establishing a state machine for controlling sub-routines. By presenting a design example, the paper will showcase the collaborative design process made possible by utilizing the proposed explorative framework.

## 2. Methods

To investigate the technologies and techniques needed to support a collaborative robotic-based design process, the study applied a research-by-design strategy (Hauberg, 2011). The strategy relies on physical and digital prototyping for uncovering possible solutions and allows for a continuous and parallel process of designing the framework and designing with the framework. The design process thereby informs the development of the framework and vice versa.

### 2.1. THE PHYSICAL DESIGN SYSTEM

To facilitate continuous investigation and development of suitable methods and techniques for robotic-based design exploration, a bespoke physical design system is developed during the study. This material-based system is developed on the criteria that both designer and robot should be capable of manipulating and changing, in a reversible manner, the system’s inherent design variables. These geometric configurations also have to permit both analogue qualitative user-driven design evaluations and numeric-based performance-driven computational simulations. To meet these criteria, a façade element consisting of twenty-four identical wood lamellas within a steel frame was designed and constructed (see Figure 3). Each lamella was constrained to a pre-made groove in the bottom rail, allowing for 90-degree stepwise rotation, and fixed in a rotatable acrylic disc within the top rail, allowing for 45-degree stepwise rotations. Reconfiguration of the lamellas’ bottom parts was restricted to manual user interaction. In contrast, the top parts could be rotated through a collaborative process with a robot performing the rotational movement of the lamella and a human user removing and inserting locking pins to fixate the lamella.

On the robotic side, the physical design system consisted of a UR10 robotic arm from Universal Robots equipped with a RG6 electric gripper from OnRobot onto which Logitech’s Brio 4K Ultra HD webcam was mounted. To enable user

input, two simple push-buttons were connected to the digital inputs in the control box of the UR10.



Figure 3. The physical design system consist of 24 wood lamellas mounted in a steel frame. Variations caused by rotation of individual elements creates potential for directed views and intentional blocking of sunlight.

## 2.2. THE COMPUTATIONAL DESIGN SYSTEM

The study utilized the Rhino-Grasshopper environment for developing a computational design framework integrating the following five sub-systems. A ‘Computational Design System’ containing the generation and geometric-driven manipulation of the virtual façade system. An ‘Environmental Simulation’ that calculates the sun shading and view-blocking performance of the virtual façade system. A ‘Robotic Simulation and Control System’ that based on availability, ease of use and utility used Vicente Soler’s (UCL Bartlett) Robots for generating target planes, simulating the robotic movements and streaming code to the robot. A ‘Visual Analysis System’ containing custom components that utilize computer vision libraries from OpenCV for tracking the position of the physical wood lamellas. A ‘State Machine’ which, based on components from the MetaHopper add-on by Andrew Heumann, handles the transitions between predetermined states and triggers actions in the order they need to be executed.

### 3. Results

#### 3.1. COMPUTATIONAL FRAMEWORK FOR COLLABORATIVE DESIGN EXPLORATION

The study resulted in a collaborative framework that integrates visual analysis methods and a state machine to successfully allow for human-robot design exploration of a material system. The computational design framework allows for an interactive design exploration where a human agent, guided by design intentions regarding obstruction of desired view lines and sun shading, can manually alter the rotation of the wood lamellas. Subsequently, the robotic agent can be initiated and via the mounted camera register the current rotation for each lamella. This information allows the computational design model to perform environmental simulation based on a series of alternative lamella configuration and suggest a new and improved version by robotic rotation of the wood lamellas. As visualised in the flow chart in Figure 4, the framework allows interactions by the human designer (cyan coloured circles in the flow chart) to occur both during the physical material-based design exploration and the robotic fabrication process.

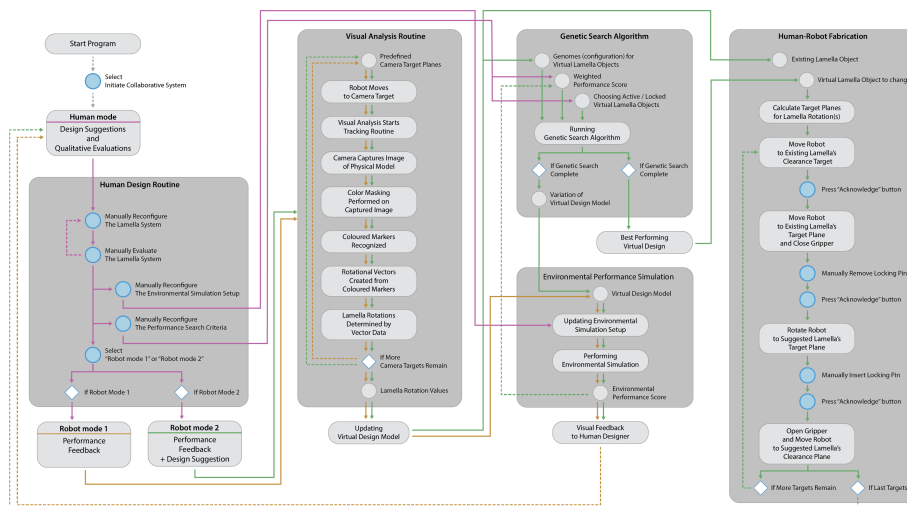


Figure 4. Flow chart for the proposed human-robot framework for collaborative design exploration. The cyan-coloured circles represent human actions during the design process while the three types of colored flow-lines refer to processes within the ‘Human mode’ (pink), ‘Robot mode 1’ (orange), and ‘Robot mode 2’ (green).

The main result of the study is the design of the collaborative framework in its entirety and the design process it supports. However, two aspects were crucial for successfully achieving this objective; the integration of visual analysis features in GH and the introduction of a state machine for controlling the interactive robotic processes.

### 3.2. VISUAL ANALYSIS IN GH

Integration of visual analysis was achieved by implementing functions from the OpenCV library into custom GH-components, thereby enabling tracking of individual lamella positions. As the standard python component in GH does not allow the use of libraries like OpenCV and NumPy, the custom VA-components were instead build using GH Python Remote by Digital Structures. The VA-components allowed two types of tracking; registration of ArUco markers and recognition of custom coloured markers. The ArUco marker, developed by Rafael Muñoz and Sergio Garrido (Garrido-Jurado et al., 2014), is a synthetic square marker identifiable by an inner binary matrix surrounded by a black border (OpenCV - Open Source Computer Vision, 2019). By attaching ArUco markers on each lamella the visual system, using the cv2.aruco module in the OpenCV library, was able to distinguish between the 0- or 90-degree rotation allowed for the bottom part of the lamella system. Custom red and cyan colour markers were applied to the top of each lamella, and by colour recognition, the VA-system could calculate the individual rotation vectors. The VA-process for tracking the custom markers consisted of a set of discrete steps, starting with the capture of two images containing the twelve wood lamella for the left and right side, respectively. As can be seen from the diagram and the pictures in Figure 5, the captured images are cropped to the boundary zone of the lamella ruling out any unwanted artefacts and allowing for efficient computation of the lamella rotation angles. Next, two image masks are created based on the predefined red and cyan colour in HSV colour mode. These masks are used to subtract the background leaving only red and cyan colour allowing a calculation of the contour for each coloured area and a subsequent approximation of the outline of these regions. A boundary rectangle for each coloured region serves to locate the individual centroids and from these establish the two-point vectors (with direction from red-centroid to cyan-centroid) that informs about the rotation of the wood lamella. Based on the bottom and top vector the twisting of each lamella was determined and the digital version of the design system could be updated so as to mirror its physical “twin”. Each of the GH components developed for visual analysis were designed with an input field for activation of the internal logic and an output field with a boolean value flagging its successful completion - simple features that were crucial for integration of a state machine.

### 3.3. STATE MACHINE IN GH

Construction of a custom state machine inside GH was achieved through custom python components and use of components from the MetaHopper add-on, as shown in Figure 6. The ‘SetObj’ component from MetaHopper allowed the framework to use the Boolean value from selected components to control the value of standard GH-buttons, in other words getting a ‘True/False’ output from one component would ‘Push/Release’ another GH-button. The state machine allowed control and activation of sequential stages in the established human-robot design process.

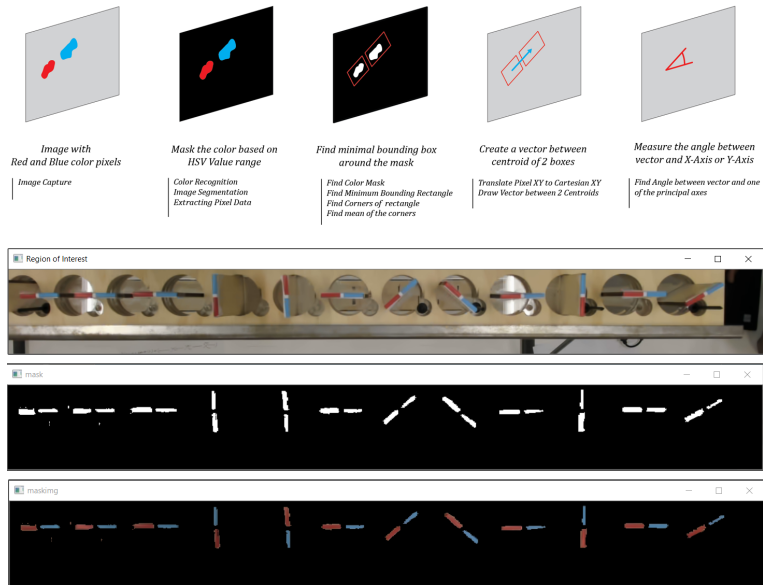


Figure 5. Top: Diagram of the visual analysis process from image data to rotational data. Bottom: Example of the visual analysis routine performed on the top side of the wood lamellas by using OpenCV in Python. The first picture shows the cropped image recorded by the robot-mounted webcam. The second picture shows the masking out of all unwanted colours. The third picture shows the result of applying the mask to the cropped image. .

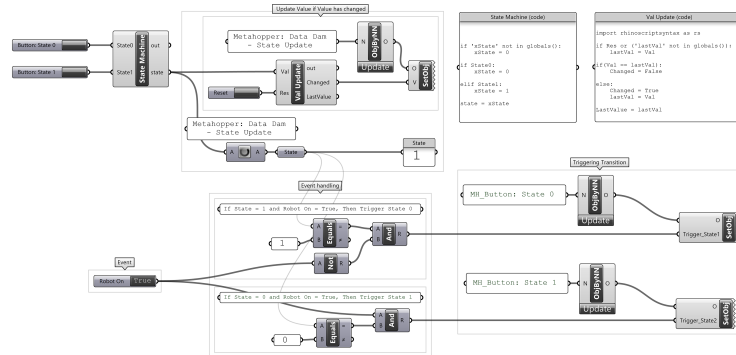


Figure 6. Example of a simple State Machine in Grasshopper. The Grasshopper definition uses custom python components and MetaHopper components to change and keep track of states. The State Machine integrated in the proposed framework is an expansion of this setup.

#### 4. Discussion

Following a research-by-design approach, this study has investigated and established a framework that allows a designer to engage directly with a physical design object, while in succession obtaining new design suggestion from a robotic system. The development process and the final result reveals essential aspects of human-robot design exploration.

The camera used to capture the coloured markers and the ArUco markers has an automatic focus feature which often affects the image capturing process and results in blurry photos with a negative effect on the colour detection procedure. During the prototyping process, this was resolved by inserting a time delay (approx. 2 seconds) between robot (and camera) arriving at capture position and the actual capturing process. Another challenge, well-known in the field of visual analysis, is the importance of lighting conditions. The colour detection algorithm used in the framework takes in the absolute HSV values from the colour system and detects accordingly within a given range the varying hue, saturation and value. In the physical setup, due to the presence of a skylight in the indoor environment, the ambient light varied by a visible spectrum to cause significant error in the colour detection. This issue can be mitigated using complete artificial light or by minimizing the effect of varying coloured light in the system.



Figure 7. Physical demonstrator placed in an outdoor environment. The façade system clearly displays its environmental performance towards shading the sun and directing views.

When taking part in a creative and collaborative design process, the experience of time and the maintenance of creative flow is essential. An important aspect of successful collaborative work is knowing the intention of the co-workers - a challenging aspect when working with robots. Not knowing what goes on “behind the scenes” during the time-span of computational performance search, which often took 30-90 seconds, leaves the designer in a state of passive waiting. Initial experiments show a significant difference in running the collaborative process with or without the opportunity to see GH-based visualisations of the computational

performance search. Through parallel design and evaluation of the framework, it was evident that the additional time used to resolve the issue of automatic focus, as mentioned above, could be solved through technological changes/upgrades. Optimising the algorithms used in the framework is another area for optimisation. Many of the computational processes run in a series, and the initiation of a task is often dependent on the completion of previous tasks. In some cases, it would be more efficient to employ multiprocessing to move the robot between the image capture targets, while simultaneously running the image analysis on previously captured images - the proposed framework currently waits for each image to be captured and processed before moving the robot to the next target position.

The study has sought to carry out foundational work on which to base applied research. The paper has focused on the technological and system-oriented aspects of collaborative human-robot design exploration and shown that the proposed framework can support such processes. For future work it will be important to investigate to what extent this robotic-based approach will affect the creative design process and if a fruitful “dialogue” can be established between a holistic-driven human designer and a performance-driven solution-proposing robot.

## References

- “OpenCV - Open Source Computer Vision” : 2019. Available from <[https://docs.opencv.org/trunk/d5/dae/tutorial\\_aruco\\_detection.html](https://docs.opencv.org/trunk/d5/dae/tutorial_aruco_detection.html)> (accessed 10th December 2019).
- Daas, M. and Wit, A.J. 2018, Introduction, in M. Dass and A.J. Wit (eds.), *Towards a Robotic Architecture*, Applied Research and Design Publishing, Novato, CA, 8-11.
- Dorst, K. and Cross, N.: 2001, Creativity in the design process: Co-evolution of problem-solution, *Design Studies*, **22**(5), 425-437.
- Dubor, A., Camprodom, G., Diaz, G.B., Reinhardt, D., Saunders, R., Dunn, K., Niemel’a, M., Horlyck, S., Alarcon-Licon, S., Wozniak-O’Connor, D. and Watt, R.: 2016, Sensors and Workflow Evolutions: Developing a Framework for Instant Robotic Toolpath Revision, *Robotic Fabrication in Architecture, Art and Design 2016*, Cham, 410-425.
- Garrido-Jurado, S., Muñoz-Salinas, R., Madrid-Cuevas, F. and Marín-Jiménez, M.: 2014, Automatic generation and detection of highly reliable fiducial markers under occlusion, *Pattern Recognition*, **47**(6), 2280-2292.
- Hauberg, J.: 2011, Research by design: a research strategy, *Architecture & Education Journal*, **1**(2), 1-11.
- Johns, R.L., Kilian, A. and Foley, N.: 2014, Design Approaches Through Augmented Materiality and Embodied Computation, *Robotic Fabrication in Architecture, Art and Design 2014*, Cham, 319-332.
- Lawson, B.: 2005, *How Designers Think - The Design Process Demystified*, Taylor & Francis.
- Maher, M.L.: 1994, Creative design using a genetic algorithm, *Computing in Civil Engineering*, New York, 2014-2021.
- Moorman, A., Sabin, J.E. and Liu, J.: 2016, RoboSense: Context-Dependent Robotic Design Protocols and Tools, *ACADIA 2016 Posthuman frontiers*, 174-183.
- Pigram, D., Maxwell, I. and Mcgee, W.: 2016, Towards Real-Time Adaptive Fabrication-Aware Form Finding in Architecture, *Robotic Fabrication in Architecture, Art and Design 2016*, **1**, 427-437.
- Wright, D.R.: 2005, “Finite State Machines” . Available from <<http://www4.ncsu.edu/~drwright3/docs/courses/csc216/fsm-notes.pdf>>.