Mogi: Multi-Orientation Gesture Interaction with a 140GHz High-Resolution On-Chip Radar

Maxim Rykunov^[0000–0001–9568–8239] and André Bourdoux^[0000–0002–9264–7850] and Hichem Sahli^[0000–0002–1774–2970] and Klaas Bombeke^[0000–0003–2056–1246] and Arthur Sluvters^[0000–0003–0804–0106] and Sébastien Lambot^[0000–0002–0358–481X]

Abstract End-users are today used to interacting with interaction surfaces of various orientations, either graphically with a mouse or pointer, or tactilely with a finger. They are also increasingly used to interacting gesturally with surfaces in multiple orientations, ranging from horizontal and oblique surfaces to vertical surfaces, most often using mid-air gestures. They now want to get used to interacting in the same way with any interface surface involving a radar, which has the advantage of being insensitive to conditions of lighting, visibility, and privacy. This paper motivates radar gesture interaction in front of interactive surfaces with multiple orientations and aims to compare the accuracy of gesture recognition in different orientations based on three categories of gesture candidates: lateral, horizontal, and vertical.

Key words: Gesture input, Gesture recognition, Multi-context interaction, Multiorientation gesture interaction, Multi-surface interaction, Radar-based gestures

1.1 Introduction

Gesture interaction, since it has been supported by efficient algorithms, ranging from 2D [\[18,](#page-10-0) [7,](#page-10-1) [23,](#page-11-0) [31\]](#page-11-1) to 3D [\[6,](#page-10-2) [4,](#page-9-0) [5,](#page-10-3) [12,](#page-10-4) [36\]](#page-12-0) and empowered by precise devices or sensors, such as radars [\[35\]](#page-12-1), stands at the forefront of today's human-computer interaction (HCI) applied in many domains of human activity [\[8\]](#page-10-5). In particular, harnessing the

Maxim Rykunov, Andre Bourdoux, Hichem Sahli, Advanced RF Program, IMEC, Gaston ´ Geenslaan, 14, B-3001 Leuven, Belgium. e-mail: [{Maxim.Rykunov,Andre.Bourdoux,Hichem.]({Maxim.Rykunov,Andre.Bourdoux,Hichem.Sahli}@imec.be) [Sahli}@imec.be]({Maxim.Rykunov,Andre.Bourdoux,Hichem.Sahli}@imec.be)

Klass Bombeke, Research Group for Media, Innovation and Communication Technologies, Department of Communication Studies, Ghent University, Campus De Krook, Platteberg, 11, B-9000 Gent, Belgium. e-mail: <Klaas.Bombeke@UGent.be>

Arthur Sluÿters, Louvain Research Institute in Management and Organizations, Université catholique de Louvain, Place des Doyens, 1, B-1348 Louvain-la-Neuve, Belgium. e-mail: [arthur.](arthur.sluyters@uclouvain.be) [sluyters@uclouvain.be](arthur.sluyters@uclouvain.be) Sébastien Lambot, Earth and Life Institute, Université catholique de Louvain, Croix du Sud, 2, B-1348 Louvain-la-Neuve, Belgium. e-mail: [sebastien.lambot@](sebastien.lambot@uclouvain.be) [uclouvain.be](sebastien.lambot@uclouvain.be)

2 Authors Suppressed Due to Excessive Length

capabilities of radar-based systems [\[14\]](#page-10-6) deployed in various configurations offers new opportunities for understanding and interpreting human gestures [\[26\]](#page-11-2), mainly hand gestures [\[12,](#page-10-4) [13\]](#page-10-7) and arm gestures [\[17\]](#page-10-8).

Gesture recognition based on radar in multiple orientations relies on sophisticated radar systems capable of capturing and analyzing gestures from different angles and perspectives, in particular with multiple input-multiple output (MIMO) capabilities [\[10,](#page-10-9) [1\]](#page-9-1). Unlike traditional approaches that may be limited by line-ofsight constraints or environmental factors, radar systems offer unparalleled flexibility and robustness. By deploying radar sensors strategically in various orientations, it becomes possible to capture a comprehensive view of human gestures in threedimensional space. On the one hand, there is an increasing demand for recognizing gestures by a radar, whether they are classical [\[34\]](#page-12-2) or specific to radars [\[33\]](#page-12-3). On the other hand, many techniques, borrowed from signal processing, machine learning, and more recently deep learning (see a systematic literature review in [\[28\]](#page-11-3), play a pivotal role in synthesizing or fusing data from multiple radar sources or multiple antennas of the same radar, enabling accurate, real-time recognition of gestures. Anyway, radar-based interaction is subject to several challenges, such as:

1. **Multi-path interference:** Radar signals may reflect on surfaces and objects present in the users' environment, leading to multi-path interference and distortions, thus resulting in inaccurate gesture detection.

Solution: Advanced signal processing techniques [\[26\]](#page-11-2), such as beamforming and adaptive filtering, can mitigate multi-path interference by isolating the desired signal from reflections. Additionally, using multiple radar sensors in different orientations can help triangulate the position of the gesture and improve accuracy.

2. **Ambiguity in gesture isolation and interpretation:** Radar signals may capture multiple gestures simultaneously or misinterpret unintended movements as gestures, leading to ambiguity in gesture recognition. The starting and ending points of the gesture should be isolated.

Solution: Machine learning can enhance accuracy by learning patterns and distinguishing between intentional gestures and background movements. Training the system with a diverse dataset of gestures in various orientations should improve its robustness and ability to generalize.

3. **Environmental disturbances:** External factors such as electromagnetic interference, weather conditions (*e.g.,* a difference of temperature or of hygrometry), and physical obstructions can degrade radar signal quality and impact gesture detection reliability.

Solution: Radars with adaptive modulation schemes and frequency agility can help mitigate the effects of environmental disturbances. Additionally, integrating complementary sensor modalities, such as cameras or infrared sensors, can provide redundancy and enhance overall system reliability. For example, a Leap Motion Controller can complement a radar [\[5\]](#page-10-3). While radars can penetrate several materials [\[21,](#page-11-4) [29\]](#page-11-5), there is still some material sensitivity that needs to be considered [\[13\]](#page-10-7).

- 1 Multi-Orientation Gesture Interaction with Mogi 3
- 4. **Calibration and synchronization:** Aligning and synchronizing multiple radar sensors operating in different orientations can be challenging [\[17\]](#page-10-8), leading to inconsistencies in gesture detection and tracking.

Solution: Implementing robust calibration and synchronization protocols ensures that data from multiple radar sensors are accurately aligned in time and space. This can involve using reference points or landmarks to calibrate sensor positions and employing time synchronization. There is also an ongoing effort to reduce the number of synchronizations needed to operate the same radar in multiple configurations to avoid re-calibrating the same radar or another one.

5. **Power consumption and cost:** Deploying multiple radar sensors in different orientations may increase power consumption and system costs, particularly in battery-operated or cost-sensitive applications. *Solution:* Radar design, particularly in its physical layout of antennas, should be

further investigated for low power consumption and explore integration with lowpower microcontrollers or system-on-chip solutions [\[6\]](#page-10-2). Additionally, leveraging advances in radar technology, such as integrated circuit miniaturization and costeffective manufacturing processes, should mitigate cost concerns.

6. **Privacy and Security:** Since a radar can be integrated into a variety of objects or materials, it becomes invisible to the users [\[21\]](#page-11-4), which on the one hand frees them from a feeling of surveillance and engages them in a sense of confidentiality, but on the other hand can still inadvertently record sensitive information or be susceptible to unauthorized access, raising concerns about privacy and security. *Solution:* Authentication mechanisms can secure communication between the radar, the computer that processes its signal, and the actuator. Privacy regulations should adopt privacy-by-design principles to minimize data collection and anonymize user information wherever possible.

Despite these challenges, radar-based gesture interaction has sparked significant interest across various domains for its potential to revolutionize the way we can interact with computer-based systems and actuators in ambient environments. In the context of multi-platform [\[3\]](#page-9-2) or multi-context systems [\[11\]](#page-10-10), this paper aims to explore the extent to which candidate gestures can be accurately and robustly recognized by one or more radars located in interaction surfaces with multiple orientations, whether lateral, horizontal or vertical. To this end, section [1.2](#page-3-0) reviews the literature in terms of multiple orientations from both a general interaction and a radar-specific point of view. Section [1.3](#page-5-0) then presents the high-frequency radar capable of capturing gestures in fine detail that we will consider in multi-orientation gesture interaction () in section [1.4.](#page-6-0) Section [1.5](#page-6-1) proposes three categories of gestures that are admissible for different orientations to be investigated. Section [1.6](#page-9-3) concludes this paper and presents some future avenues to this work.

4 Authors Suppressed Due to Excessive Length

1.2 Related Work

This section progressively reviews some work related to multi-orientation interaction, first with the graphical modality, then with the gestural modality, first with any other sensor than a radar, and then with a radar.

1.2.1 Multi-Orientation Graphical Interaction

Lachenal and Coutaz [\[16\]](#page-10-11) defined an ontology of interaction surfaces, a central concept in our work since everything can be considered as an interaction surface as soon as a radar is embedded in it. Now that our ambient environment is equipped with electronic chips and interconnected sensors, it offers an array of opportunities for new forms of interaction. In this environment, interaction surfaces play a crucial role.

In civil architecture, surfaces break down our ambient environment into zones, such as the rooms in a house or the waiting areas in an airport, enabling activities specific to each zone to emerge or be carried out via each surface. In HCI, the screen remains the preferred interaction surface, but is increasingly replaced by other surfaces. Each of these surfaces has a specific purpose and interactional qualities: one is movable while the other is fixed, one is rigid while the other is deformable. All these surfaces are widespread and have special relationships with us, particularly interactional relationships: all surfaces are perceived by the senses, manipulated by our motor actions and serve a purpose.

There are two types of interaction surface [\[16\]](#page-10-11): (1) an *action surface* is a subset of a physical surface on which a user can act directly with effectors or indirectly via sensors; (2) an *observation surface* is a subset of a physical surface that an actor can observe using sensors.

The topology of interaction surfaces is fundamental as it expresses how different surfaces are organized in space to support a distributed interaction. Lachenal and Coutaz [\[16\]](#page-10-11) defined *surface coupling* and *compatibility* between surfaces. The topology defines the position and orientation of entities in a reference system, including actors, surfaces, and instruments. If we focus on interaction surfaces, the state of the art shows that the spatial relationships between surfaces are important. For example in BuILD-It $[24]$, the graphical representations of domain concepts depends on the **orientation** of the interaction surface: the same concept is represented in 3D on a vertical surface (a wallscreen and a laptop) and in 2D on a horizontal surface (a tabletop). The detection of a change in the orientation of a surface, or its displacement in space, brings into play localization algorithms that have yet to be mastered. The physical characteristics of an interaction surface include, but are not limited to[\[16\]](#page-10-11):

- The geometric shape: a 2D surface such as a regular plane, a regular or irregular polygon, or a 3D surface, such as induced by a spherical display.
- The size: the extent of the shape.

)RAFT

1 Multi-Orientation Gesture Interaction with Mogi 5

- The weight: the mass of the surface.
- The material: the constituent materials of the surface, such as wood, glass, and PVC [\[29\]](#page-11-5), fabrics [\[21\]](#page-11-4), plaster, plastic, water, or steam.
- The texture: uniform or irregular.
- The social use: public, private, semi-private.
- The proxemics use: close intimate $(0-15 \text{ cm})$, intimidate $(15-45 \text{ cm})$, personal (45 cm) cm-1.2 m), social (1.2 m - 3.6 m), public (λ 3.6 m), and remote.

1.2.2 Multi-Orientation Interaction by Gesture

Research on tactile interaction on surfaces has shown that performance and error rates are impacted by the orientation, with tapping being faster on vertical surfaces (by at least 5%) and dragging being faster and more accurate on horizontal surfaces [\[23\]](#page-11-0). Furthermore, the orientation of objects on horizontal displays can be used to establish personal space, create a public space, and as part of gestures. Marquardt [\[18\]](#page-10-0) suggests that a continuum of interaction space, where gestures and direct touch are integrated, can lead to more expressive interactions. Xia et al. [\[35\]](#page-12-1) explore the use of surface and motion gestures on mobile devices for 3D manipulation of objects on large surfaces, finding reasonably good agreement between gestures and input.

Regal [\[25\]](#page-11-7) also identified gesture preferences for a vertical or horizontally-oriented multi-touch input device were tested. Kruger [\[15\]](#page-10-12) shows that adjusting the orientation of objects can be used to establish personal space, to create a public space, and is used as a significant part of gestures that direct comments, ask for help, and indicate interest. For example, the Hands-Up system [\[20\]](#page-11-8) takes advantage of the ceiling as a horizontal interaction surface to display information and to enable an end-user laying on a bed to interact using a Microsoft Kinect. For example, opening and closing the hand near the head turns the lights on and off, respectively. Performing a lasso gesture with two fingers near the head and making a circular movement horizontally will toggle all items displayed on/off.

1.2.3 Multi-Orientation Interaction by Radar-based Gestures

Radar-based gesture recognition has seen significant advancements in recent years, with neural network-based models for gesture classification and orientation estimation, achieving high accuracy rates. Doppler radars have been extensively tested [\[6,](#page-10-2) [36\]](#page-12-0), including Huang [\[13\]](#page-10-7) who introduced a Doppler radar with metamaterial-based antennas for hand-gesture sensing

Latern [\[37\]](#page-12-4) presents a novel system for dynamic continuous hand gesture recognition based on a frequency-modulated continuous wave radar sensor and employs a recurrent 3-D convolutional neural network to classify dynamic hand gestures. Martinez and Villarreal [\[19\]](#page-11-9) introduced the concept of zenithal gestures: when people

6 Authors Suppressed Due to Excessive Length

Fig. 1.1: Radar-based interaction with surfaces having different orientations: (1) mid-air gestures in front of a vertical wall-screen[\[22\]](#page-11-10); (2) mid-air gestures in front of an obliquely-oriented tablet (Source: [IMEC video\)](https://player.vimeo.com/video/335405660?title=0&byline=0&portrait=0); (3) mid-air gestures on top of a horizontal tablet (Source: [IMEC video\)](https://player.vimeo.com/video/335405660?title=0&byline=0&portrait=0); (4) front gestures with a radar in the foreground (Source: [Hand gestures\)](https://optimalhealthsolutions.ca/unlock-the-secret-healing-power-of-hand-gestures-part-two/); (5) back gestures with a radar in the background; (6) ceiling gestures with a radar in the ceiling (Source: [IMEC video\)](https://player.vimeo.com/video/335405660?title=0&byline=0&portrait=0); (7) zenithal gestures from the ceiling [\[19\]](#page-11-9); (8) bi-surface gestures with two surfaces (Source: [RadarSense video\)](https://www.youtube.com/watch?v=jFPtYdWeW_s&t=6s).

are entering a building, they can interact with the ambient environment by performing arm gestures that are captured by a sensor placed in the ceiling, at the zenithal position of their standing, hence its name. Fig. [1.1](#page-5-1) shows representative examples of radar-based interaction with surface having different orientations.

1.3 IMEC's 140 GHz Radar

While low- or mid-frequency radars can be used for mid-air gesture interaction [\[28\]](#page-11-3), high-frequency radar offers the ideal trade-off regarding performance, cost, energy usage, and dimensions. Radar systems with carrier waves exceeding 100 GHz are, in principle, able to detect subtle gestures thanks to enhanced depth resolution, to measure the gesture speed accurately thanks to Doppler shifts (which is very important for motion gestures), and can be very compact, especially when antennas

くAI

1 Multi-Orientation Gesture Interaction with Mogi 7

Fig. 1.2: IMEC's 140 GHZ radar positioned on the IEEE Continuum.

are integrated on the radar chip. For these reasons, we chose the 140GHz highresolution on-chip radar (Fig. [1.2\)](#page-6-2) developed by the Interuniversity Microelectronics Centre (IMEC) [1](#page-6-3). The two main components of this radar chip are a transceiver with integrated antennas and a low-power phase-locked loop (ADPLL) to generate the modulated carrier wave. These two components are designed in 28nm bulk CMOS technology, enabling high integration and low-cost volume production. This radar holds in a $10 \times 10mm^2$ package, thereby making it very compact while achieving superior radar performance: a +11.5 dBm effective isotropic radiated power (EIRP) per TX element, a 10 GHz bandwidth, $a > 55$ mm range resolution and sub-mm range accuracy, and a wideband transition to and from the antenna.

1.4 Multi-Orientation Gesture Interaction with the 140 GHz Radar

Based on the ontology of interaction surfaces [\[16\]](#page-10-11), we define *Multi-orientation Gesture Interaction* (MOGI) with a radar as the capability of an ambient environment to capture the end user's gestures in a single view from interaction surfaces having multiple possible orientations, such as horizontal, vertical, and oblique. These orientations can be materialized through different surfaces that are tracked along the three traditional dimensions (Fig. [1.3\)](#page-7-0): frontal, lateral, and transversal.

1.5 Candidates for Multi-Orientation Gesture Interaction

The accuracy of radar-based gesture recognition depends mainly on the surface area of the gesture exposed to the radar, its distance, and its movement over time [\[28\]](#page-11-3). Two gestures with a very close exposure surface, for example two fingers or three raised fingers, are likely to be confused for this reason. It is therefore essential to examine candidate gestures for multi-orientation recognition as a function of the surface area exposed in the direction of the radar.

See [https://www.imec-int.com/en/expertise/radar-sensing-systems/](https://www.imec-int.com/en/expertise/radar-sensing-systems/140ghz-radar-modules) [140ghz-radar-modules](https://www.imec-int.com/en/expertise/radar-sensing-systems/140ghz-radar-modules)

DRAF

8 **8** Authors Suppressed Due to Excessive Length

Fig. 1.3: Interaction surfaces with different orientations in different planes.

Candidates for a **lateral** radar-based gesture interaction include:

- 1. *Pointing gestures*: deictic gestures, which point towards specific directions to select objects or to indicate directions, are welcome as soon as the outstretched arm provides sufficient, differentiating lateral exposure.
- 2. *Tap gestures*: tapping or lightly hitting the air to trigger, to confirm actions, or to select items in a menu [\[18\]](#page-10-0) are admissible candidates provided that their lateral exposure is significant enough.
- 3. *Swiping gestures*: side-to-side swipes, which are often used for navigating through menus or flipping through pages [\[23\]](#page-11-0), are admissible provided that their lateral exposure, which varies over time as a function of the swipe, is differentiating.
- 4. *Flicking gestures*: flicks, which are considered as swiping gestures that are quickly performed over a small length, are often used for scrolling through content or dismissing items.
- 5. *Hand wave gestures*: waving a hand from side to side or making specific patterns with a hand, which are often used for activating or dismissing notifications or controlling media playback, can be detected by lateral radars [\[12\]](#page-10-4).
- 6. *Zooming gestures*: pinching or expanding gestures made with the hands, not the fingers, can be used for zooming in or out on content [\[22\]](#page-11-10), similar to pinch-tozoom on touchscreens, except that the fingers are too small to be detected.
- 7. *Rotation gestures*: rotating your hand [\[22\]](#page-11-10) or making clockwise or counterclockwise gestures can be used for tasks such as rotating or resizing objects.

)RAFT

1 Multi-Orientation Gesture Interaction with Mogi 9

Candidate gestures to be recognized by a radar placed on a **horizontal** surface, such as a ceiling [\[20\]](#page-11-8), should be easily recognizable from the top and include:

- 1. *Horizontal gestures*: any gesture belonging to the aforementioned categories can represent candidates provided that they are exposed horizontally enough [\[25\]](#page-11-7).
- 2. *Finger counting gestures*: these gestures, where the number of fingers extended is interpreted as a command or input, can be recognized provided that they are exposed horizontally, not vertically.
- 3. *Gesture sequences*: complex sequences of gestures, which can be customized to perform specific actions or trigger events, can also be recognized by advanced ceiling radars.

Similarly to gestures detected from the ceiling, gestures that can be recognized by a floor sensor depend on the capabilities of the radar itself and the horizontal exposure, such as:

- 1. *Foot gestures*: gestures made with the feet, especially those that are close to the surface, can include tapping, kicking, or specific foot patterns to control devices, navigate through interfaces, or play games.
- 2. *Leg gestures*: gestures of the legs, such as lifting or extending them in specific patterns, can be used for tasks like selecting options from a menu, controlling virtual characters, or triggering actions in a virtual environment.
- 3. *Whole body gestures*: some floor radars are able of detecting larger-scale gestures of the body, such as leaning, stepping, or jumping. These gestures can be utilized for immersive experiences in virtual reality applications, fitness tracking, or interactive installations.
- 4. *Dancing gestures*: dance movements and choreographic gestures, allow users to interact with music or visualizations through their dance motions. This can be used for entertainment purposes, dance training, or artistic expression.
- 5. *Pressure sensing gestures*: some floor sensors are able of detecting variations in pressure distribution, allowing them to recognize gestures such as shifting weight from one foot to another, or applying pressure in specific areas. These gestures are more challenging to recognize by radars which are not sensitive to pressure but can detect acceleration variations, such as when jumping, hitting, or foot tapping.

Finally, radars placed on an interaction surface **in front** of the end-user probably offer the widest range of gestures candidates, which include:

- 1. *Hand gestures*: such gestures, such as waving, pointing, or making specific shapes, symbols, or letters with the hands, can be detected by frontal radars [\[13\]](#page-10-7). These gestures are often used to control devices found in ambient environments, interact with virtual interfaces, or navigate through menus.
- 2. *Finger gestures*: gestures of individual fingers or combinations of fingers can be recognized by frontal radars, provided that their vertical exposure is wide enough. For example, pinching, tapping with specific fingers, or making gestures like the peace sign can be interpreted as commands or inputs.

10 Authors Suppressed Due to Excessive Length

- 3. *Palm gestures*: Gestures involving the hand palm, such as open-handed gestures, palm rotations, or covering and uncovering the palm, are among the best candidates for gesture-based interaction [\[33,](#page-12-3) [28\]](#page-11-3).
- 4. *Arm gestures*: gestures of the arms [\[17\]](#page-10-8), such as raising, lowering, or extending them in specific directions, can be recognized by frontal radars. These gestures can be used for tasks like controlling virtual objects, or adjusting settings (*e.g.,* increase or decrease the sound level).
- 5. *Head and shoulders gestures*: frontal radars can also detect gestures of the head, such as nodding, shaking, or tilting it in different directions provided that their vertical exposure is large enough to differentiate the gesture variations. Same for shoulder gestures [\[32\]](#page-11-11).

1.6 Conclusion

In conclusion, radar-based gesture interaction represents a paradigm shift in humancomputer interaction, offering a seamless and intuitive way to engage with digital systems. By examining this technology from multiple orientations, we should gain a better understanding of its capabilities, applications, and implications. In particular, we should be able to better understand which gesture candidates are recognized with accuracy enough in various orientations to warrant their inclusion in a gesture set.

Acknowledgements The authors of this paper are very grateful to the anonymous reviewers whose suggestions helped improve and clarify this manuscript. Arthur Sluÿters is funded by the ["Fonds](https://www.frs-fnrs.be/en/) [de la Recherche Scientifique - FNRS"](https://www.frs-fnrs.be/en/) under Grants n°40001931 and n°40011629.

References

- 1. Albaba, A., Bauduin, M., Verbelen, T., Sahli, H. & Bourdoux, A. Forward-Looking MIMO-SAR for Enhanced Radar Imaging in Autonomous Mobile Robots. *IEEE Access*. **11** pp. 66934-66948 (2023), <https://doi.org/10.1109/ACCESS.2023.3291611>
- 2. Anslow, C., Campos, P., Lucero, A., Grisoni, L., Augstein, M. & Wallace, J. Collaboration Meets Interactive Surfaces and Spaces (CMIS): Walls, Tables, Mobiles, and Wearables. *Proceedings of the ACM International Conference on Interactive Surfaces And Spaces, ISS 2016, Niagara Falls, Ontario, Canada, 6-9 November 2016*. pp. 505-508 (2016), <https://doi.org/10.1145/2992154.2996359>
- 3. Aquino, N., Vanderdonckt, J., Condori-Fernandez, N., Dieste Tubío & Pastor, O. Usability evaluation of Multi-device/platform User Interfaces Generated by Model-Driven Engineering. *Proceedings of the ACM International Symposium on Empirical Software Engineering and Measurement, ESEM 2010, Bolzano/Bozen, Italy, 16-17 September 2010*. pp. 1-10 (2010), <https://doi.org/10.1145/1852786.1852826>
- 4. Attygalle, N., Leiva, L., Kljun, M., Sandor, C., Plopski, A., Kato, H. & Pucihar, K. No Interface, No Problem: Gesture Recognition on Physical Objects Using Radar Sensing. *Sensors*. **21**, 5771 (2021), <https://doi.org/10.3390/s21175771>

)RAFT

1 Multi-Orientation Gesture Interaction with Mogi 11

- 5. Attygalle, N., Vuletic, U., Kljun, M. & Pucihar, K. Towards Hand Gesture Recognition Prototype Using the iwr6843isk Radar Sensor and Leap Motion. *Proceedings of The 8th Human-Computer Interaction Slovenia, HCI SI Conference 2023, Maribor, Slovenia, January 26, 2024*. **3657** pp. 78-88 (2023), <https://ceur-ws.org/Vol-3657/paper9.pdf>
- 6. Berenguer, A., Oveneke, M., Khalid, H., Alioscha-Perez, M., Bourdoux, A. & Sahli, H. ´ GestureVLAD: Combining Unsupervised Features Representation and Spatio-Temporal Aggregation for Doppler-Radar Gesture Recognition. *IEEE Access*. **7** pp. 137122-137135 (2019), <https://doi.org/10.1109/ACCESS.2019.2942305>
- 7. Beuvens, F. & Vanderdonckt, J. Designing graphical user interfaces integrating gestures. *Proceedings of the 30th ACM International Conference on Design of Communication, SIGDOC '12, Seattle, Washington, USA, 3-5 October 2012*. pp. 313-322 (2012), [https:](https://doi.org/10.1145/2379057.2379116) [//doi.org/10.1145/2379057.2379116](https://doi.org/10.1145/2379057.2379116)
- 8. Carfi, A. & Mastrogiovanni, F. Gesture-Based Human-Machine Interaction: Taxonomy, Problem Definition, and Analysis. *IEEE Trans. Cybern.*. **53**, 497-513 (2023), [https:](https://doi.org/10.1109/TCYB.2021.3129119) [//doi.org/10.1109/TCYB.2021.3129119](https://doi.org/10.1109/TCYB.2021.3129119)
- 9. Dessart, C., Motti, V. & Vanderdonckt, J. Showing user interface adaptivity by animated transitions. *Proceedings of the 3rd ACM Symposium on Engineering Interactive Computing System, EICS 2011, Pisa, Italy, 13-16 June 2011*. pp. 95-104 (2011), [https://doi.org/](https://doi.org/10.1145/1996461.1996501) [10.1145/1996461.1996501](https://doi.org/10.1145/1996461.1996501)
- 10. Feng, R., Greef, E., Rykunov, M., Sahli, H., Pollin, S. & Bourdoux, A. Multipath Ghost Recognition for Indoor MIMO Radar. *IEEE Trans. Geosci. Remote. Sens.*. **60** pp. 1-10 (2022), <https://doi.org/10.1109/TGRS.2021.3109381>
- 11. Genaro Motti, V., Raggett, D., Van Cauwelaert, S. & Vanderdonckt, J. Simplifying the development of cross-platform web user interfaces by collaborative model-based design. *Proceedings of the 31st ACM International Conference on Design of Communication, SIGDOC 2013, Greenville North Carolina USA 30 September 2013- 1 October 2013*. pp. 55-64 (2013), <https://doi.org/10.1145/2507065.2507067>
- 12. Grobelny, P. & Narbudowicz, A. MM-Wave Radar-Based Recognition of Multiple Hand Gestures Using Long Short-Term Memory (LSTM) Neural Network. *Electronics*. **11** (2022), <https://www.mdpi.com/2079-9292/11/5/787>
- 13. Huang, S. & Tseng, C. Hand-gesture sensing Doppler radar with metamaterial-based leakywave antennas. *Proceedings of the IEEE International Conference on Microwaves for Intelligent Mobility, ICMIM 2017*. pp. 49-52 (2017), [https://doi.org/10.1109/ICMIM.2017.](https://doi.org/10.1109/ICMIM.2017.7918853) [7918853](https://doi.org/10.1109/ICMIM.2017.7918853)
- 14. Khalid, H., Pollin, S., Gielen, T., Cappelle, H., Glassee, M., Bourdoux, A. & Sahli, H. ´ Gesture Recognition with an FMCW Radar. *Proceedings of the 31st Benelux Conference on Artificial Intelligence (BNAIC 2019) and the 28th Belgian Dutch Conference on Machine Learning (Benelearn 2019), Brussels, Belgium, 6-8 November 2019*. **2491** (2019), [https:](https://ceur-ws.org/Vol-2491/demo66.pdf) [//ceur-ws.org/Vol-2491/demo66.pdf](https://ceur-ws.org/Vol-2491/demo66.pdf)
- 15. Kruger, R., Carpendale, S., Scott, S. & Greenberg, S. Roles of Orientation in Tabletop Collaboration: Comprehension, Coordination, and Communication. *Comput. Support. Cooperative Work.*. **13**, 501-537 (2004), <https://doi.org/10.1007/s10606-004-5062-8>
- 16. Lachenal, C. & Coutaz, J. A Reference Framework for Multi-Surface Interaction. *Proceedings of the 10th International Conference on Human-Computer Interaction: Universal Access In HCI, HCI International 2003, Crete, Greece, 22-27 June 2003, Volume 4*. pp. 424-428 (2003), [https://www.researchgate.net/publication/228377628_A_](https://www.researchgate.net/publication/228377628_A_reference_framework_for_multi-surface_interaction) [reference_framework_for_multi-surface_interaction](https://www.researchgate.net/publication/228377628_A_reference_framework_for_multi-surface_interaction)
- 17. Lementec, J. & Bajcsy, P. Recognition of arm gestures using multiple orientation sensors: gesture classification. *Proceedings of the 7th International IEEE Conference on Intelligent Transportation Systems, ITSC 2004, Washington, WA, USA, 3-6 October 2004*. pp. 965-970 (2004), <https://doi.org/10.1109/ITSC.2004.1399037>
- 18. Marquardt, N., Jota, R., Greenberg, S. & Jorge, J. The Continuous Interaction Space: Interaction Techniques Unifying Touch and Gesture on and above a Digital Surface. *Proceedings of the 13th IFIP TC 13 International Conference on Human-Computer Interaction,*

RAFT

INTERACT 2011, Lisbon, Portugal, 5-9 September 2011, Part III. **6948** pp. 461-476 (2011), https://doi.org/10.1007/978-3-642-23765-2%5C_32

- 19. Martıinez-Ruiz, F. & Villarreal-Narvaez, S. Eliciting User-defined Zenithal Gestures for Privacy Preferences. *Proceedings Of The 16th International Joint Conference on Computer Vision, Imaging And Computer Graphics Theory And Applications, VISIGRAPP 2021, Volume 2: HUCAPP, Online Streaming, February 8-10, 2021*. pp. 205-213 (2021), <https://doi.org/10.5220/0010259802050213>
- 20. Oh, J., Jung, Y., Cho, Y., Hahm, C., Sin, H. & Lee, J. Hands-up: motion recognition using Kinect and a ceiling to improve the convenience of human life. *Proceedings of ACM International Conference on Human Factors In Computing Systems, CHI '12, Extended Abstracts*. pp. 1655-1660 (2012), <https://doi.org/10.1145/2212776.2223688>
- 21. Palipana, S., Salami, D., Leiva, L. & Sigg, S. Pantomime: Mid-Air Gesture Recognition with Sparse Millimeter-Wave Radar Point Clouds. *Proc. ACM Interact. Mob. Wearable Ubiquitous Technol.*. **5**, 27:1-27:27 (2021), <https://doi.org/10.1145/3448110>
- 22. Parthiban, V., Maes, P., Sellier, Q., Sluÿters, A. & Vanderdonckt, J. Gestural-Vocal Coordinated Interaction on Large Displays. *Proceedings of the ACM SIGCHI Symposium on Engineering Interactive Computing Systems, EICS 2022, Sophia Antipolis, France, 21-24 June 2022*. pp. 26-32 (2022), <https://doi.org/10.1145/3531706.3536457>
- 23. Pedersen, E. & Hornbæk, K. An experimental comparison of touch interaction on vertical and horizontal surfaces. *Proceedings of the 7th Nordic Conference on Human-Computer Interaction: Making Sense Through Design, NordiCHI 2012, Copenhagen, Denmark, 14-17 October 2012*. pp. 370-379 (2012), <https://doi.org/10.1145/2399016.2399074>
- 24. Rauterberg, M., Fjeld, M., Krueger, H., Bichsel, M., Leonhardt, U. & Meier, M. BUILD-IT: a planning tool for construction and design. *Proceedings of the ACM International Conference on Human Factors in Computing Systems, CHI 1998, Los Angeles, California, USA, 18-23 April 1998*. pp. 177-178 (1998), <https://doi.org/10.1145/286498.286657>
- 25. Regal, R., Gomer, J. & Moore, K. Gesture Preference with Horizontal and Vertical Multi-touch Devices. *Proceedings of the International Conference on Ergonomics Modeling, Usability & Special Populations, AHFE 2016, 27-31 July 2016, Walt Disney World, Florida, USA*. pp. 357-366 (2017), https://doi.org/10.1007/978-3-319-41685-4_32
- 26. Safa, A., Corradi, F., Keuninckx, L., Ocket, I., Bourdoux, A., Catthoor, F. & Gielen, G. Improving the Accuracy of Spiking Neural Networks for Radar Gesture Recognition Through Preprocessing. *IEEE Trans. Neural Networks Learn. Syst.*. **34**, 2869-2881 (2023), [https:](https://doi.org/10.1109/TNNLS.2021.3109958) [//doi.org/10.1109/TNNLS.2021.3109958](https://doi.org/10.1109/TNNLS.2021.3109958)
- 27. Sellier, Q., Sluÿters, A., Vanderdonckt, J. & Poncin, I. Evaluating gesture user interfaces: Quantitative measures, qualitative scales, and method. *International Journal of Human-Computer Studies*. **185** pp. 103242 (2024), <https://doi.org/10.1016/j.ijhcs.2024.103242>
- 28. Sluÿters, A., Lambot, S., Vanderdonckt, J. & Vatavu, R. RadarSense: Accurate Recognition of Mid-air Hand Gestures with Radar Sensing and Few Training Examples. *ACM Trans. Interact. Intell. Syst.*. **13** (2023,9), <https://doi.org/10.1145/3589645>
- 29. Sluÿters, A., Lambot, S., Vanderdonckt, J. & Villarreal-Narvaez, S. Analysis of User-Defined Radar-Based Hand Gestures Sensed Through Multiple Materials. *IEEE Access*. **12** pp. 27895- 27917 (2024), <https://doi.org/10.1109/ACCESS.2024.3366667>
- 30. Sousa, K., Filho, H., Vanderdonckt, J., Rogier, E. & Vandermeulen, J. User interface derivation from business processes: a model-driven approach for organizational engineering. *Proceedings of ACM Symposium on Applied Computing, SAC 2008, Fortaleza, Ceara, Brazil, 16-20 March 2008*. pp. 553-560 (2008), <https://doi.org/10.1145/1363686.1363821>
- 31. Vanderdonckt, J., Roselli, P. & Perez-Medina, J. !FTL, an Articulation-Invariant Stroke Ges- ´ ture Recognizer with Controllable Position, Scale, and Rotation Invariances. *Proceedings of the ACM International Conference on Multimodal Interaction, ICMI 2018, Boulder, CO, USA, 16-20 October 2018*. pp. 125-134 (2018), <https://doi.org/10.1145/3242969.3243032>
- 32. Vanderdonckt, J., Magrofuoco, N., Kieffer, S., Perez, J., Rase, Y., Roselli, P. & Villar- ´ real, S. Head and Shoulders Gestures: Exploring User-Defined Gestures with Upper Body. *Proceedings of the International Conference, on Design, User Experience, And Usability, DUXU 2019, held as part of the 21st HCI International Conference, HCII 2019,*

RAFT

1 Multi-Orientation Gesture Interaction with Mogi 13

Orlando, FL, USA, July 26-31, 2019, Proceedings, Part II. **11584** pp. 192-213 (2019), https://doi.org/10.1007/978-3-030-23541-3%5C_15

- 33. Villarreal-Narvaez, S., Şiean, A., Sluÿters, A., Vatavu, R. & Vanderdonckt, J. Informing Future Gesture Elicitation Studies for Interactive Applications that Use Radar Sensing. *Proceedings of the ACM International Conference on Advanced Visual Interfaces*. (2022), [https://doi.](https://doi.org/10.1145/3531073.3534475) [org/10.1145/3531073.3534475](https://doi.org/10.1145/3531073.3534475)
- 34. Villarreal-Narvaez, S., Sluÿters, A., Vanderdonckt, J. & Vatavu, R. Brave New GES World: A Systematic Literature Review of Gestures and Referents in Gesture Elicitation Studies. *ACM Computing Surveys*. **56**, 128:1-128:55 (2024), <https://doi.org/10.1145/3636458>
- 35. Xia, Z., Oyekoya, O. & Tang, H. Effective Gesture-Based User Interfaces on Mobile Mixed Reality. *Proceedings of the ACM Symposium on Spatial User Interaction*. (2022), [https:](https://doi.org/10.1145/3565970.3568189) [//doi.org/10.1145/3565970.3568189](https://doi.org/10.1145/3565970.3568189)
- 36. Wang, Z., Yu, Z., Lou, X., Guo, B. & Chen, L. Gesture-Radar: A Dual Doppler Radar Based System for Robust Recognition and Quantitative Profiling of Human Gestures. *IEEE Transactions On Human-Machine Systems*. **51**, 32-43 (2021), [https://doi.org/10.1109/](https://doi.org/10.1109/THMS.2020.3036637) [THMS.2020.3036637](https://doi.org/10.1109/THMS.2020.3036637)
- 37. Zhang, Z., Tian, Z. & Zhou, M. Latern: Dynamic Continuous Hand Gesture Recognition Using FMCW Radar Sensor. *IEEE Sensors Journal*. **18**, 3278-3289 (2018), [https://doi.](https://doi.org/10.1109/JSEN.2018.2808688) [org/10.1109/JSEN.2018.2808688](https://doi.org/10.1109/JSEN.2018.2808688)