

# CareWell

Cooperative Human Activity Recognition and  
Localization for Healthcare and Wellbeing

## Overview

Matthias Pätzold  
Mobile Communications Group

Department of Information and Communication Technology  
University of Agder

# Outline

- Introduction
- Vision of CareWell
- Objectives of CareWell
- Structure of CareWell
- Main Research Areas of CareWell
- Outlook

# Introduction: Fact Sheet



Duration

**01.01.2020–31.12.2023**



Funded by

**RCN**



Research Partners

**4**

- University of Agder (UiA)
- Norwegian University of Science and Technology (NTNU)
- University of San Luis Potosí (UASLP), Mexico
- Aalto University, Finland



Budget

**24 MNOK**

RCN Funding



**Ca. 16 MNOK**

**IKTPLUS**



Municipality Partner

**1**

Lillesand kommune



Industry Partners

**2**

- Super Radio
- Tingtun

# CareWell Team: Professors

Mathias Pätzold  
Professor, UiA



Project Manager

Yuriy Rogovchenko  
Professor, UiA



Michael Cheffena  
Professor, NTNU



Stephen Sigg  
Professor, Aalto Uni.



Carlos Adrian Gutierrez  
Professor, UASLP



# CareWell Team: Researchers, Post docs, and PhD

Muhammad Muaaz  
Researcher, UiA



Rym Hicheri  
Researcher, UiA



Nurilla Avazov  
Post doc, UiA



Altay Zhakatayev  
Post doc, UiA



Hasan Najjar  
PhD, UiA



Masoud Mohtadifar  
PhD, NTNU



Sahil Waqar  
PhD, UiA



# Vision of CareWell



## Objectives of CareWell

To realize our vision of a non-wearable sensor system that can not only detect but also locate a large number of human activities with high accuracy.

1. To collect, for the first time ever, combined radio-frequency (RF) and acoustic sensor data set in the presence of active users.
2. To develop a data augmentation framework, for generating synthetic RF data that represents human movements, which consequently reduces the training data collection efforts by a factor of at least 100.
3. To estimate the velocity and localize dynamic human body parts from RF sensor data.
4. To detect at-least 20 user activities with an accuracy of 97%.
5. To develop a prototype that detects activities in real-time and localizes dynamic human body parts within a sub-decimeter range.
6. To perform market and stakeholder analysis towards a resilient business plan.

# What Makes CareWell Different?

## CareWell

1. Highly realistic channel model
  - Sum-of-cisoids concept
  - Nonstationary aspects
  - Environmental aspects
  - 3D Model
2. Software-based design approach
3. Joint RF and audio sensing

**Channel Models in CareWell: Concluding on human activities from the received RF signal**

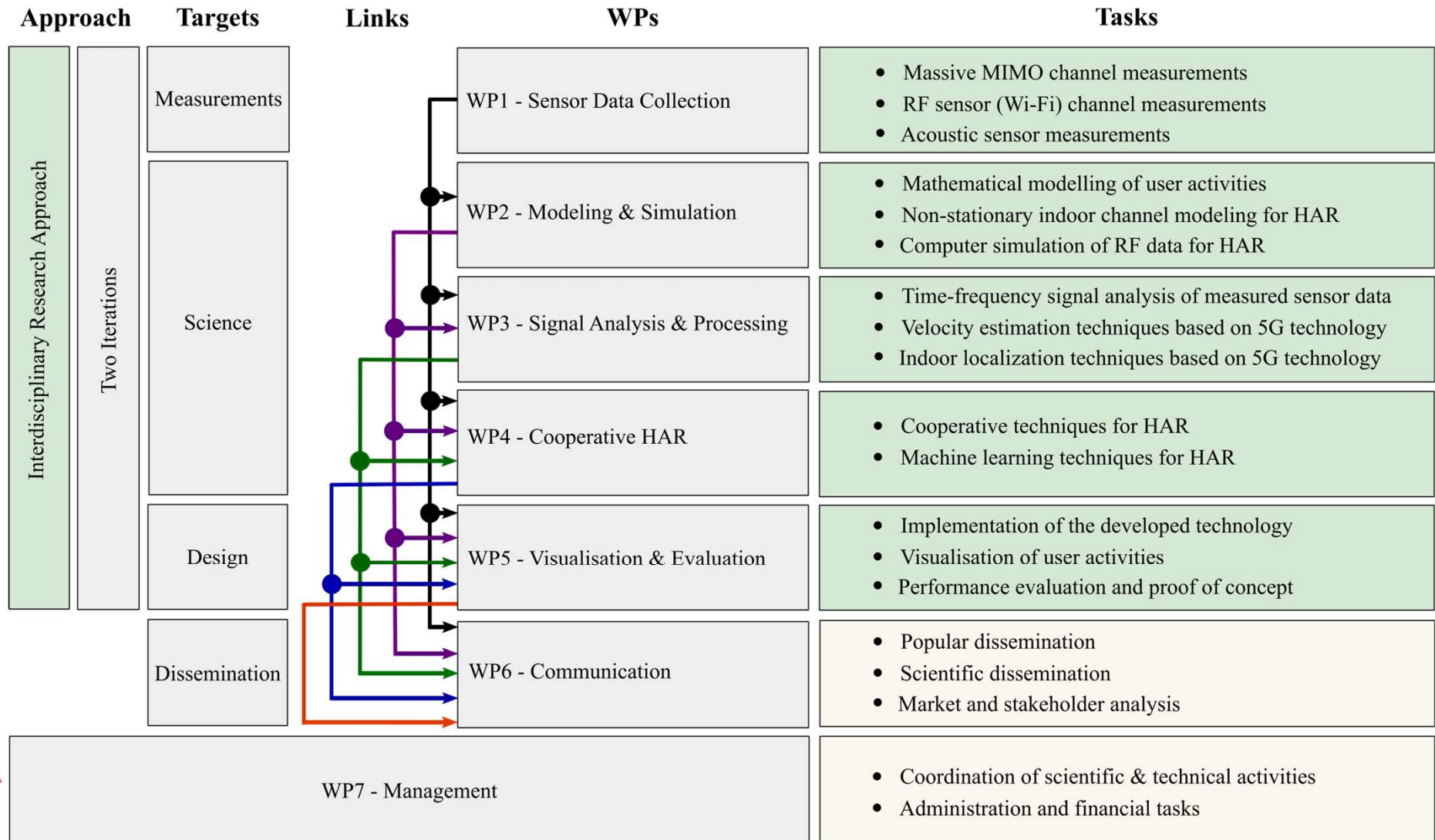
## Other Solutions

1. Simplified channel model
2. Experimental-based design approach
3. Mostly single sensing modality

**Traditional channel models: Studying the influence of walking persons on the characteristics of the received signal**



# Structure of CareWell



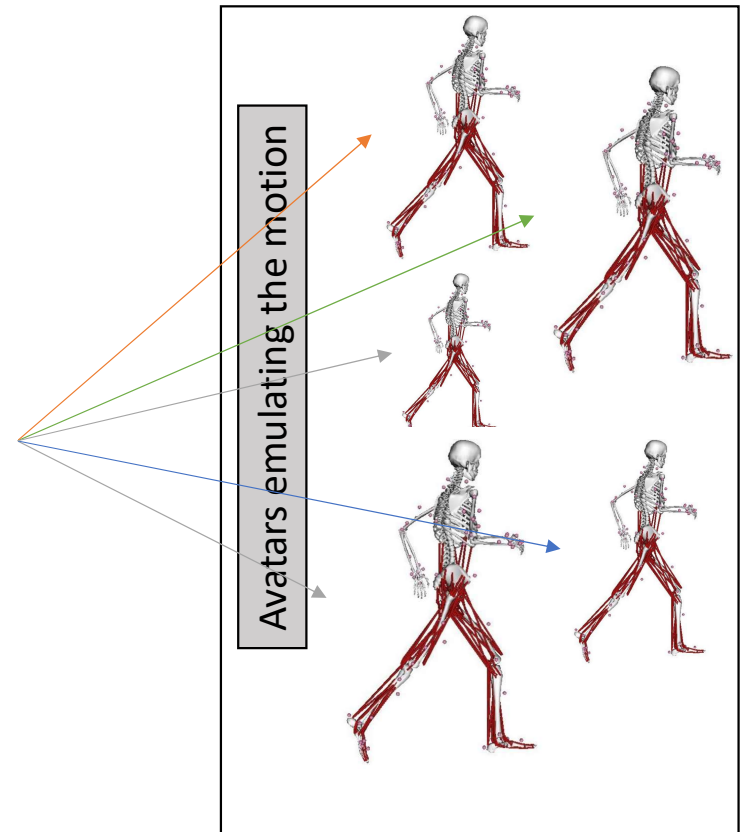
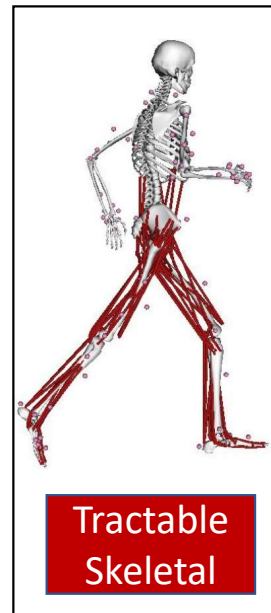
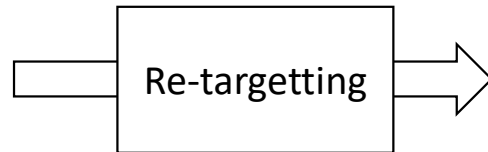
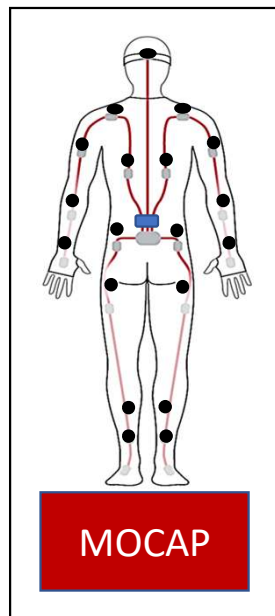
# Main Research Areas of CareWell

1. Modelling and Simulation
2. Localization of Moving Objects
3. Cooperative Human Activity Recognition (HAR)

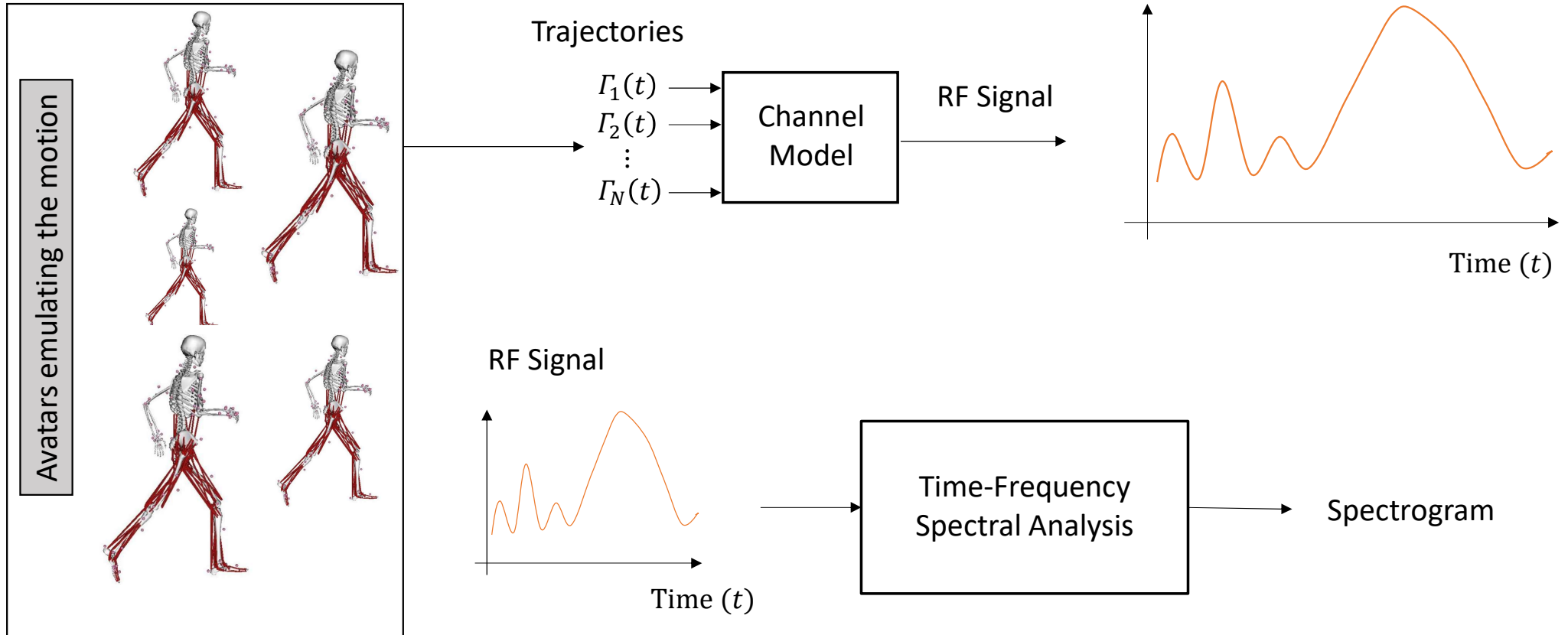
# Modelling and Simulation

To investigate the impact of dynamic human body segments of a person performing different activities on the micro-Doppler signatures.

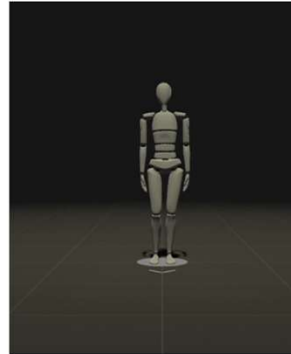
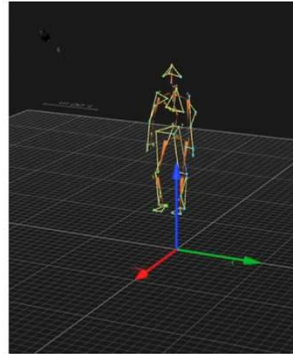
- Full-body skeletal model
- Trajectory driven channel models



# Modelling and Simulation

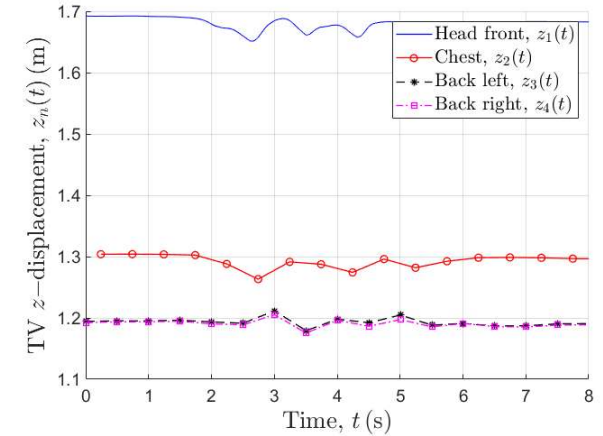
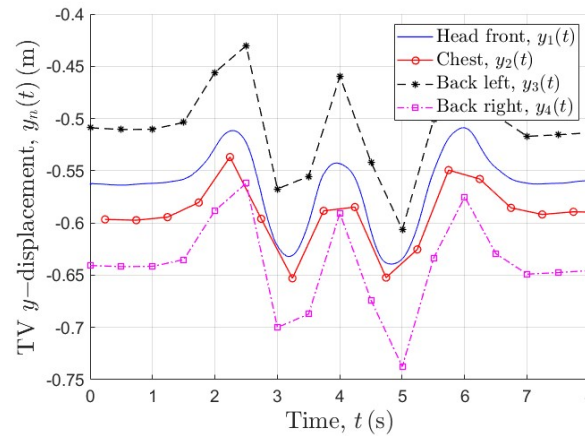
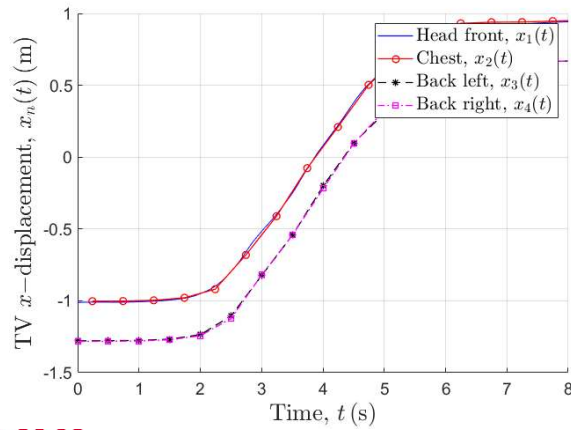


# Concept in Action

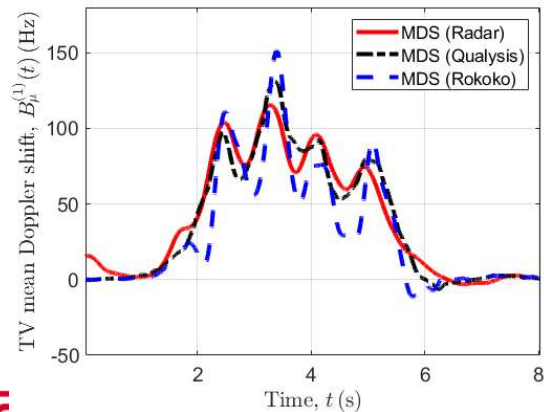
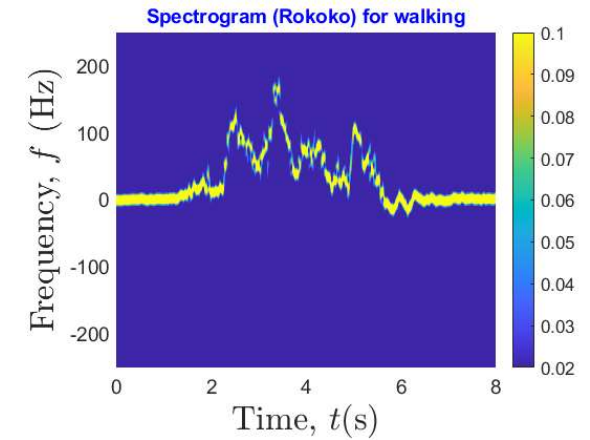
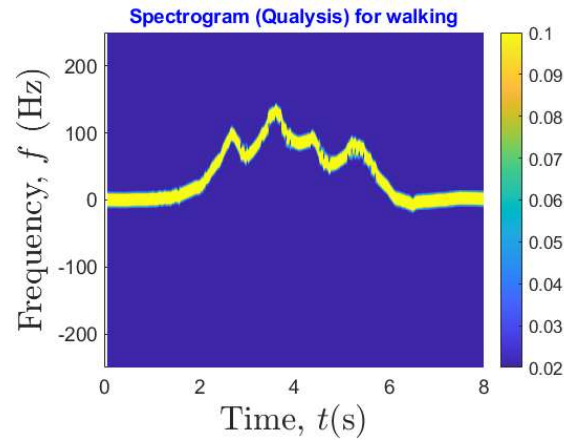
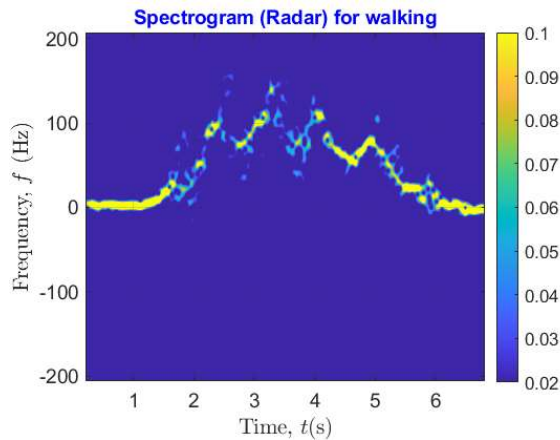


Parameters	Values
$(x_T, y_T, z_T)$	$(3.1, 0, 1.1) \text{ m}$
$(x_R, y_R, z_R)$	$(3.1, 0, 1.1) \text{ m}$
Carrier frequency $f_c$	24.125 GHz
Bandwidth B	250 MHz

- Trajectories of body segments for the walking activity



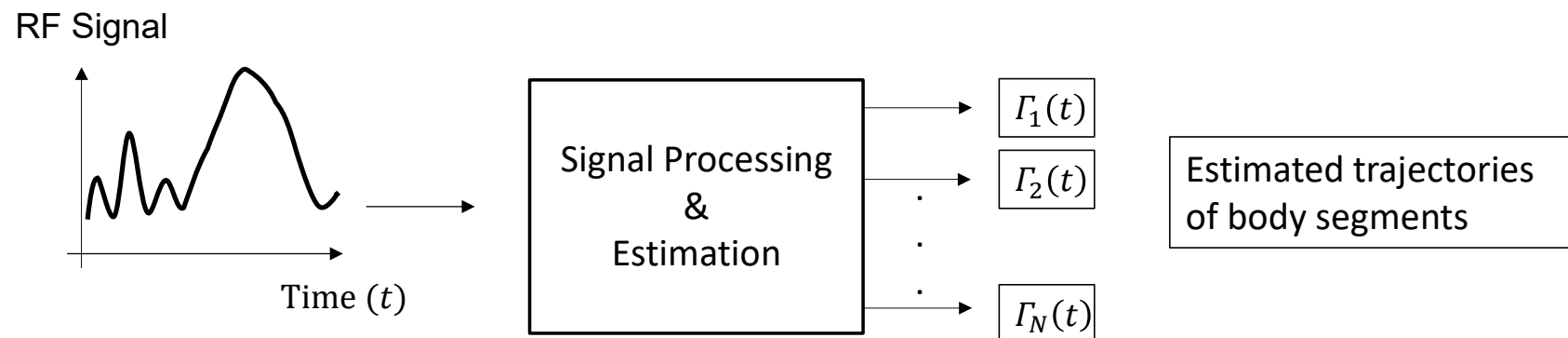
# Concept in Action



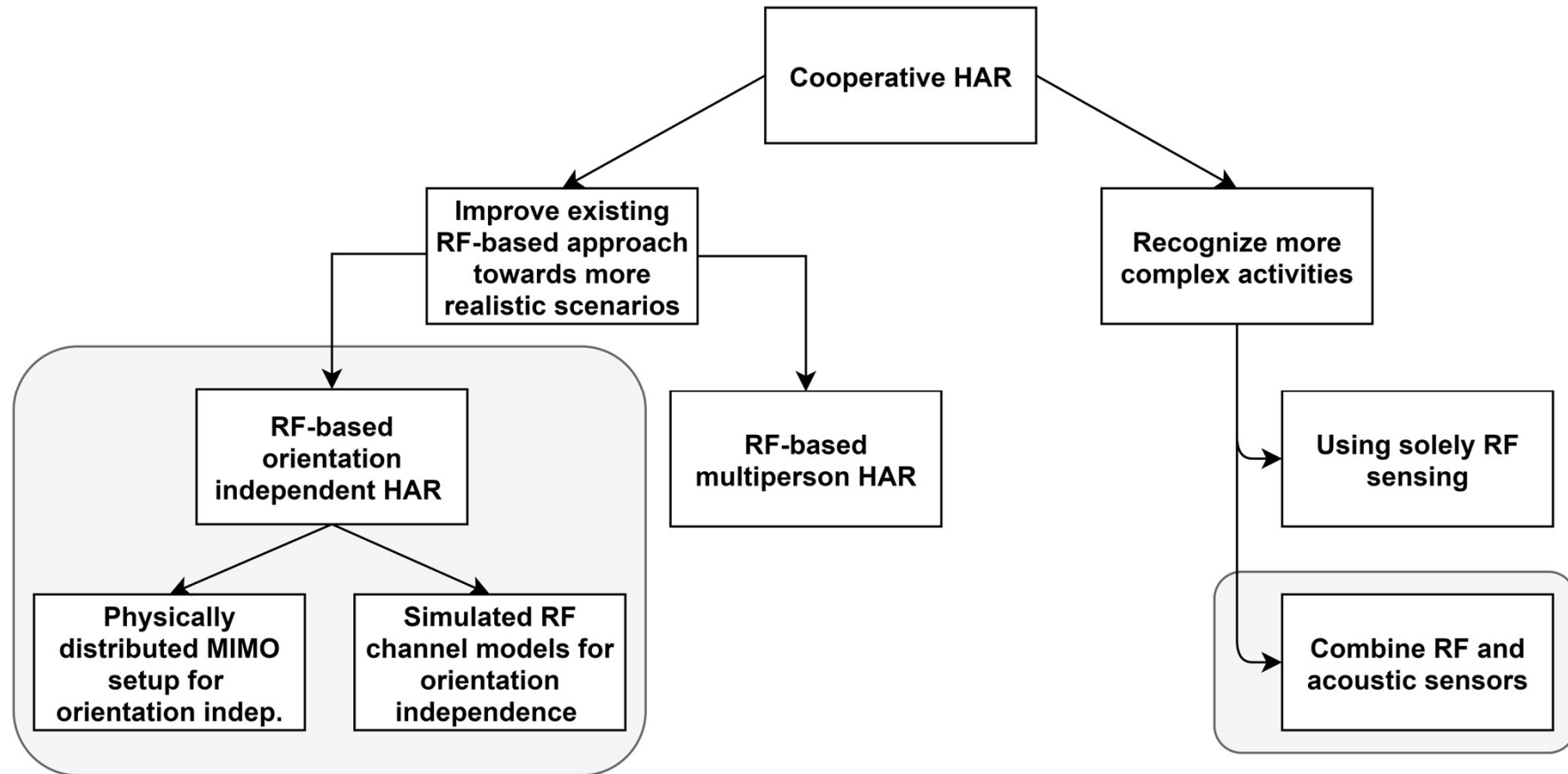
- A Good match between the spectrogram of the measured RF data and those of the trajectory-driven simulation model (MOCAP data).
- The TV mean Doppler shift of the Qualisys data-driven simulation model demonstrates a good fit to the one of the measure radar data.

# Localization of Moving Objects

To estimate the velocity and localization of active body segments from RF sensor data.

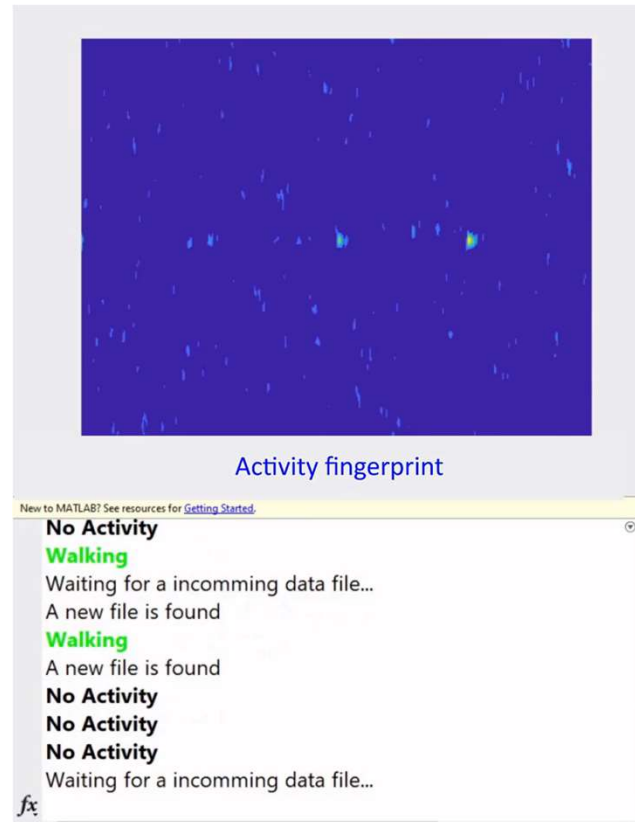
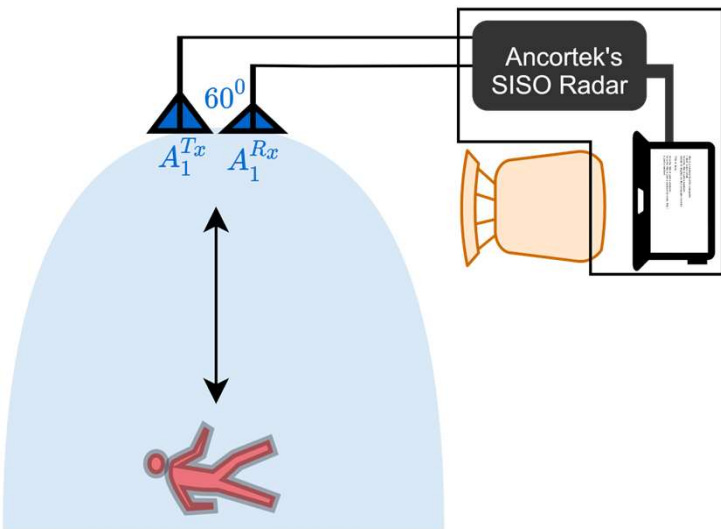


# Cooperative HAR

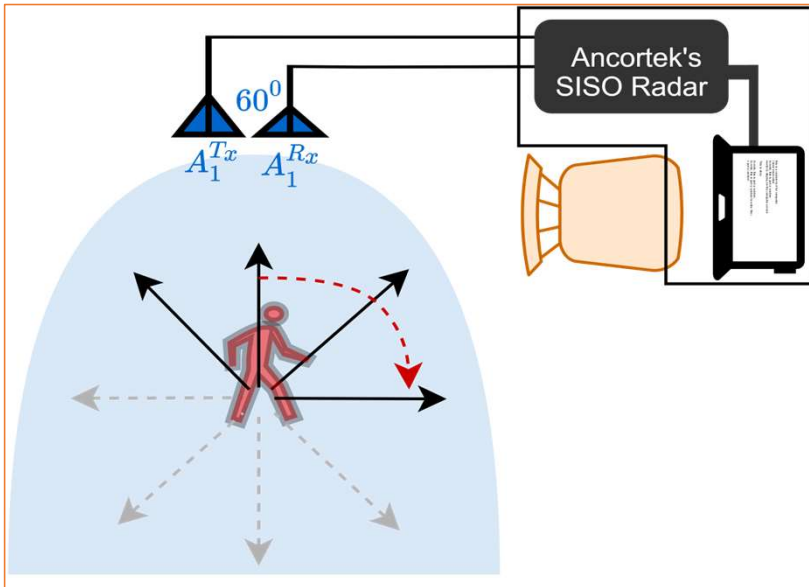




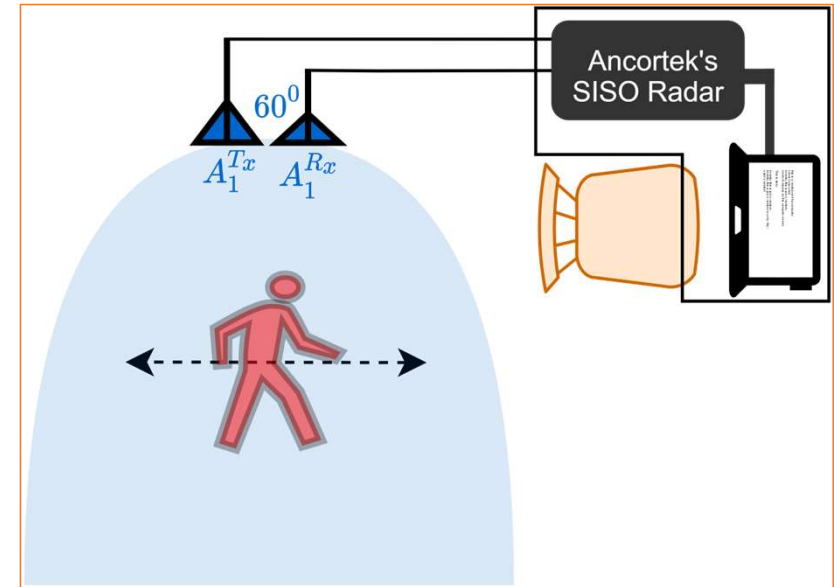
# RF-Based HAR in Action



# Orientation independent HAR

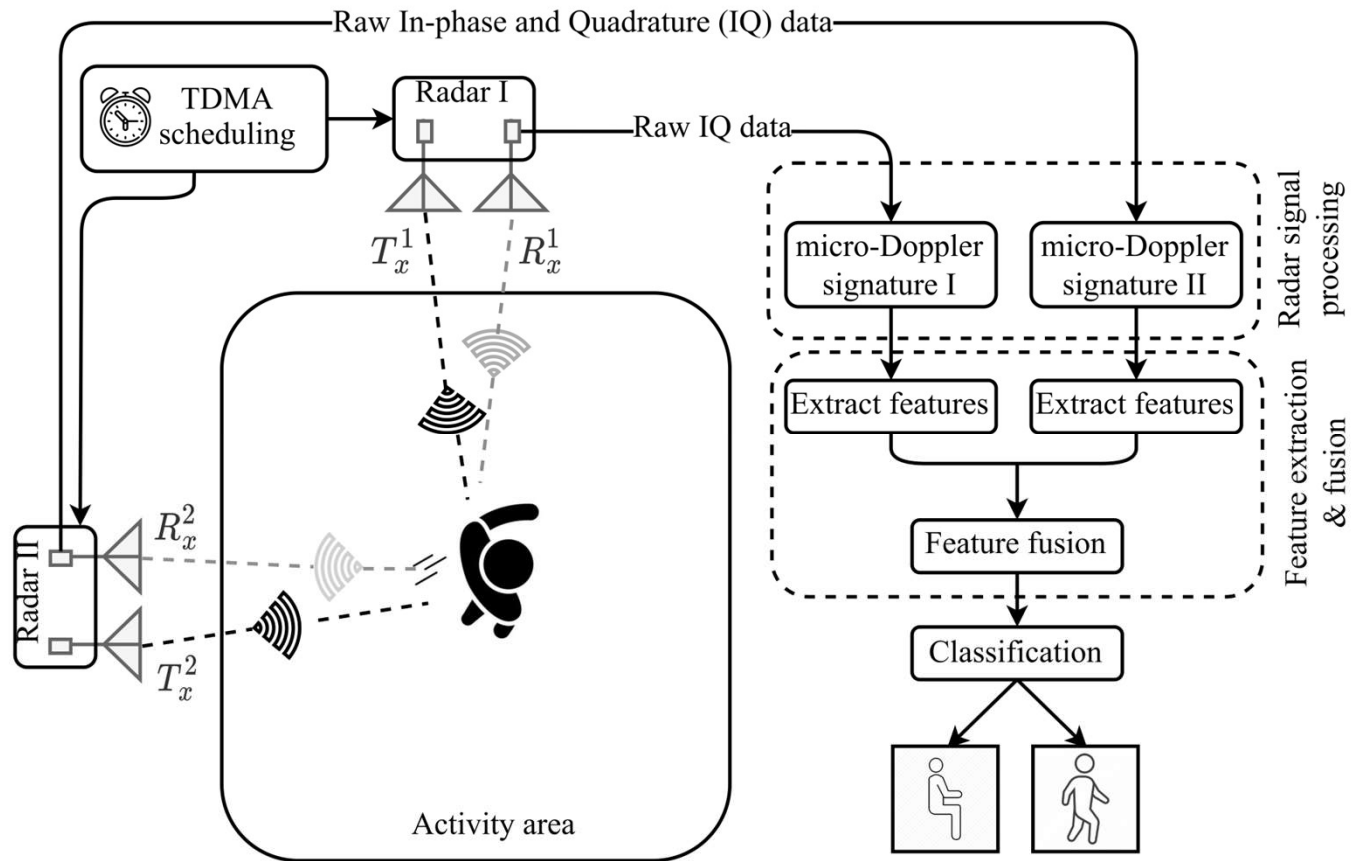


Activity fingerprint significantly changes and become less distinct, as we move from parallel to perpendicular.

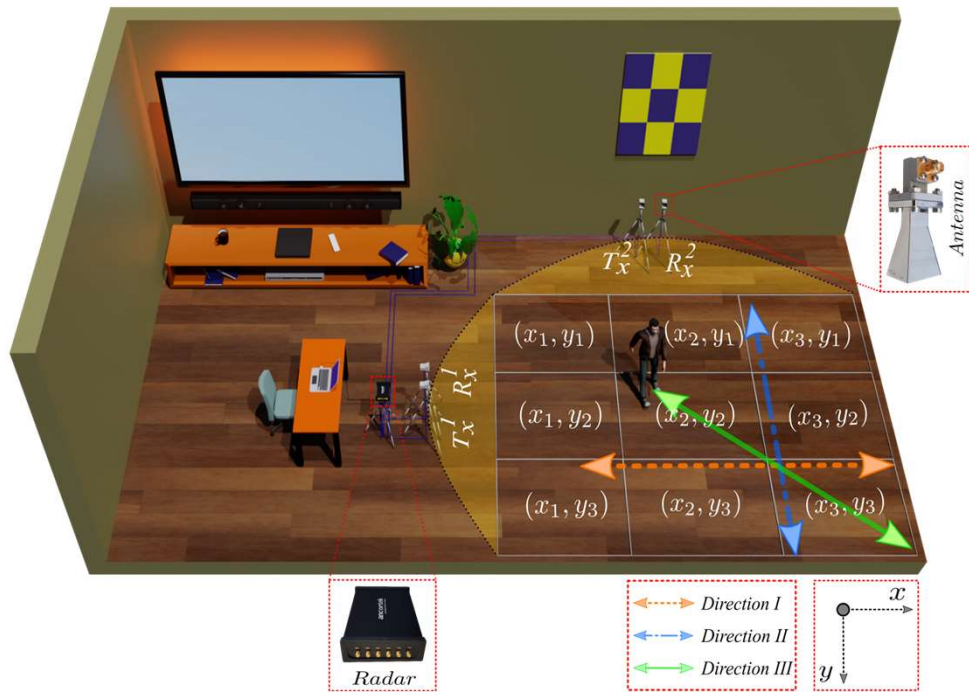


The system does not perform well when activities are performed perpendicular to the boresight of the radar.

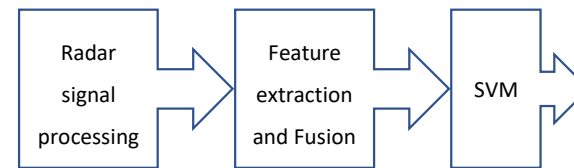
# Orientation independent HAR



# Orientation independent HAR

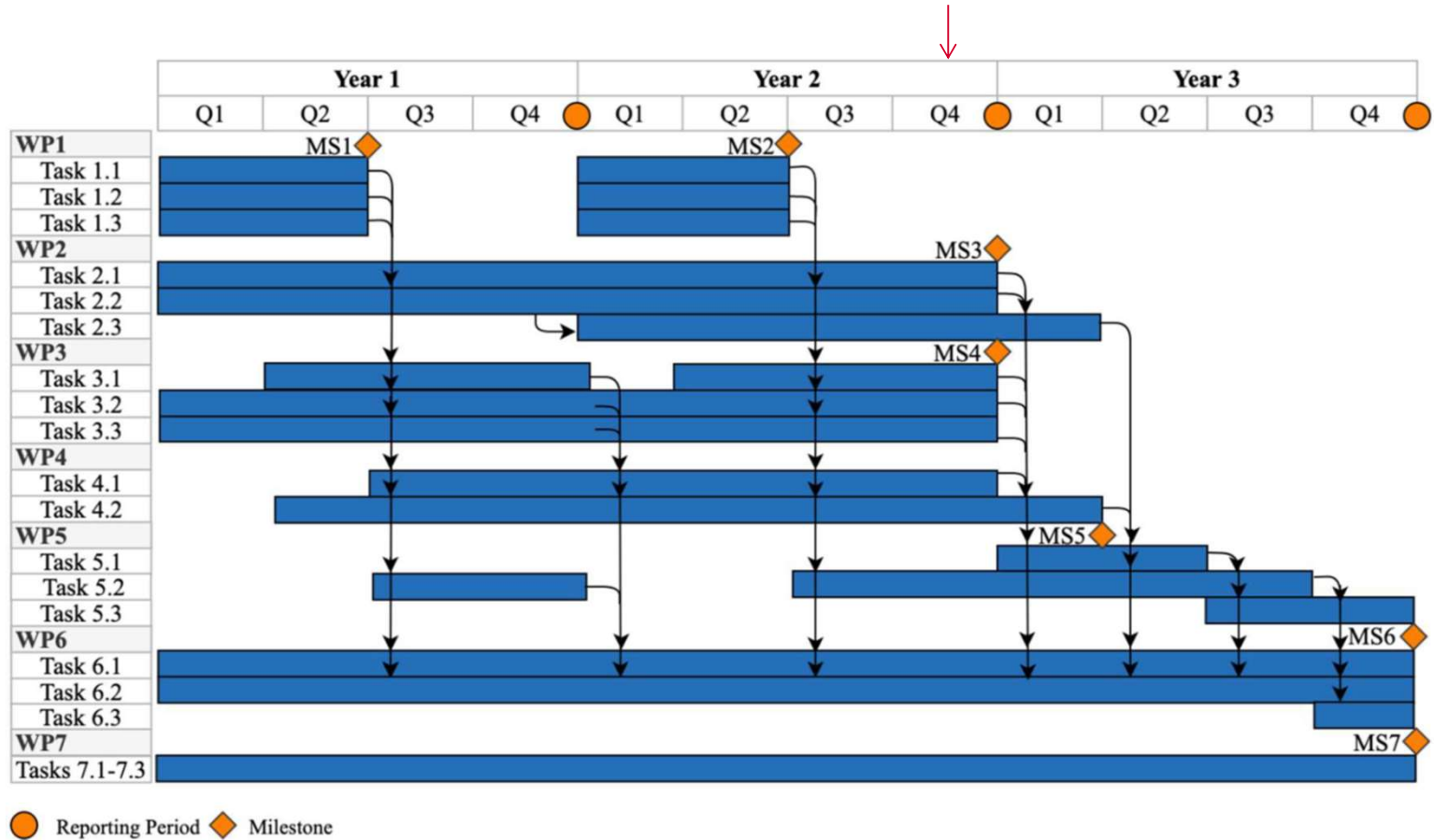


Activity description	Person #						Total Activities
	1	2	3	4	5	6	
Falling	60	60	18	18	-	-	156
Walking	80	80	40	40	24	24	288
Sitting down on the chair	105	105	27	27	27	27	318
Standing up from the chair	105	105	27	27	27	27	318
Picking up an object from the ground	105	105	27	27	27	27	318
<b>Total</b>	-	-	-	-	-	-	<b>1398</b>



Actual labels	Predicted labels					
	Fall	Walk	Stand	Sit	Pick	
Fall	42 100% 0.00%	0 0.00%	0 0.00%	0 0.00%	0 0.00%	42 100% 0.00%
Walk	0 0.00%	88 100% 0.00%	0 0.00%	0 0.00%	0 0.00%	88 100% 0.00%
Stand	0 0.00%	0 0.00%	103 100% 0.00%	0 0.00%	0 0.00%	103 100% 0.00%
Sit	0 0.00%	0 0.00%	0 0.00%	81 100% 0.00%	0 0.00%	81 100% 0.00%
Pick	0 0.00%	0 0.00%	1 0.96%	5 5.81%	90 93.75% 6.25%	96 98.54% 1.46%
	42 100% 0.00%	88 100% 0.00%	104 99.04% 0.96%	86 94.19% 5.81%	90 100% 0.00%	410 98.54% 1.46%

# Where we are?



# Project Pipeline and Trends in RF Sensing

Technology	WiCare (2018 – 2021)	CareWell (2020 – 2023)	Future Projects ( $\geq 2023$ )
RF Sensing system	Wi-Fi	Radar	mmWave radar
Antenna system	SISO	SISO & MIMO	MIMO & massive MIMO
Frequency range	2.4 GHz	24 GHz	> 60 GHz
Sensing modalities	RF	RF & audio	Multimodal
Features	Few basic activities (falling, walking, etc.)	Sequences of complex activities	Fine grained activities
Applications	HAR	HAR and eHealth	HAR, eHealth, sports, ...

# Thank you



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Contact Information

**Mobile Communications Group,**  
Faculty of Engineering and Science,  
University of Agder,  
4898, Grimstad, Norway.



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