

## PerCom 2025

The 23rd IEEE International Conference on Pervasive Computing and Communications (PerCom 2025), Washington DC, USA, from March 17 to 21, 2025

## WiSense 2025

The 2nd International Workshop on Pervasive Wireless Sensing and Edge Computing

# PhysiFi: WiFi Sensing for Monitoring Therapeutic Robotic Systems

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# Motivation

Physical Therapy is essential for patients recovering from limb-impairing strokes to:

- Regain mobility
- Restore limb functionality

Practicing Physical Therapists on Decline:

- In 2021 over 22,000 physical therapists left the practice<sup>7</sup>

Limitations of Current Autonomous Physical Therapy Systems Monitoring:

- Physical Therapist present monitoring exercises
- Camera based technologies



# Wi-Fi Sensing

## What is Wi-Fi Sensing?

Use of ambient Wi-Fi signals to detect changes in an environment.

## Pros of Wi-Fi Sensing:

- Non-invasive
- Low-Cost
- Uses Channel State Information (CSI) between transmitter (TX) and receiver (RX)
- Can work in Non-Line-of-sight (NLoS)

# Proposed Solution: PhysiFi

**PhysiFi** is a system that analyzes Channel State Information (CSI) from ambient Wi-Fi signals and employs a deep neural network (DNN) based model for robot assisted physical therapy monitoring.

The system has two goals:

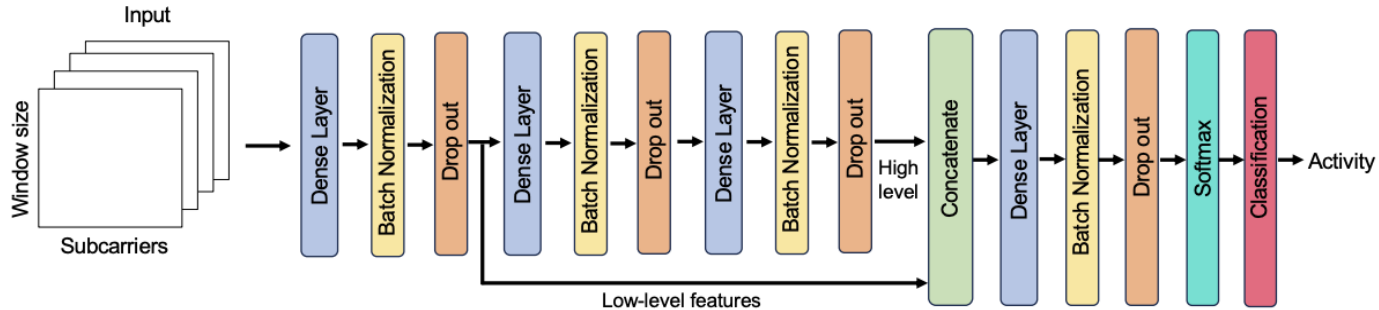
- Recognize robot assisted therapy movements
- Assess patient compliance

# PhysiFi: Preprocessing

- **Step 1:** Gather raw CSI data
- **Step 2:** Utilize Hampel Filter to detect and correct anomalies.
- **Step 3:** Use window averaging to smooth temporal fluctuations.
- **Step 4:** Perform Principal Component Analysis (PCA) to reduce dimensionality and noise.

# PhysiFi: Recognition Process

- **Step 1:** Extract low-level features
- **Step 2:** Process high-level features
- **Step 3:** Merge both feature sets for robust recognition.
- **Step 4:** Classify robotic movements and patient compliance.



DNN model architecture

# Experiments

## Setup

- Low cost ESP32-CSI-Toolkit
- One transmitter (TX) & one receiver (RX)
- CSI packet frequency: 100Hz
- Aluminum foil room divider



## Activities:

- 3 basic arm movements



## Data Collection:

- Activity time: 5 seconds, Rest/transition time: 5 seconds
- 15 times in a round robin fashion (total ~1 hour data)
- Extracted **amplitudes** from CSI + **preprocessing**: Window averaging, PCA

## Split:

- **70% training** (robot only scenario)
- **30% test** (robot only scenario and human-arm strapped scenario combined).

# Challenges

- **Environmental Noise:** WiFi CSI signals were affected by surrounding movement
- **Robot Location:** The robot could not be placed in a secluded environment, potentially introducing unintended signal interference.





# Activities



FORWARD-INWARD



UP-DOWN



LEFT-RIGHT

# Results

True Labels	Forward-Inward	99.48	0.52	5.00
	Up-Down	0.00	100.00	0.00
	Left-Right	2.42	2.09	95.49
	Predicted Labels	Forward-Inward	Up-Down	Left-Right

(a)

True Labels	Forward-Inward	96.64	0.98	2.38
	Up-Down	7.05	91.33	1.63
	Left-Right	0.00	0.30	99.70
	Predicted Labels	Forward-Inward	Up-Down	Left-Right

(b)

True Labels	Forward-Inward	90.49	9.36	0.15
	Up-Down	55.61	43.87	0.52
	Left-Right	74.06	22.48	3.46
	Predicted Labels	Forward-Inward	Up-Down	Left-Right

(c)

True Labels	Forward-Inward	95.77	4.23	0.00
	Up-Down	23.31	75.63	1.07
	Left-Right	1.93	0.46	97.61
	Predicted Labels	Forward-Inward	Up-Down	Left-Right

(d)

	Scenario	Accuracy (%)
a	Robot only	98.5%
b	Strapped Arm with full compliance (Volunteer 1)	95.9%
c	Strapped Arm without compliance (Volunteer 1)	44.2%
d	Strapped Arm with full compliance (Volunteer 2)	90.2%

# Summary

## Achievements:

- High accuracy compliance recognition
- Low-cost monitoring system
- Robustness across different users
- Privacy concerns addressed

## Extensions:

- Exploring multi-limb rehabilitation scenarios
- Test performance in various environments with more volunteers
- Enhancing model generalization for partial compliance detection

## Applications:

- Remote physical therapy monitoring.
- Assisting therapists in tracking patient progress.

Thank you!

Questions?

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