

Integration of Distributed Event Detection in Wireless Motion-Based Training Devices



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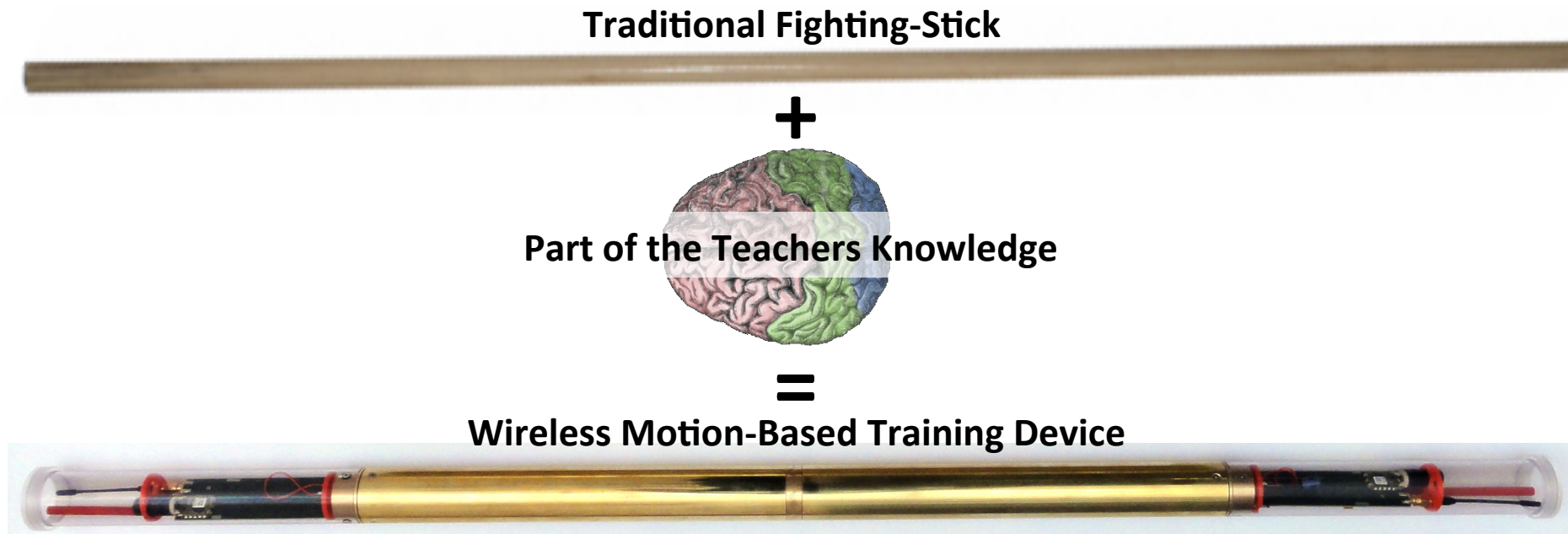
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Typical scenario in YOUR life

- Imagine, your Stick-Fight Master is for tee.
- You have to train during his absence.
- If you make a mistake, you may get used to it.
 - It would help to have an intelligent Fighting Stick



Motivation

- Computer based Sports, Games and Medical Aid gain in importance
- Immediate feedback is often needed without contact to any kind of base station
- Learn from devices which are a priory trained by teachers or therapists

Goal

- Intuitive devices with embedded intelligence
- Real-World usability
- High accuracy during event detection

Wireless & motion-based applications

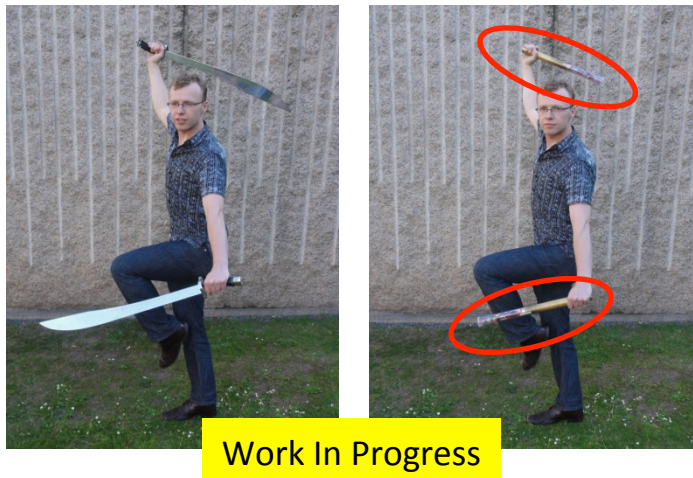
1. Fence Monitoring AVS-Extrem



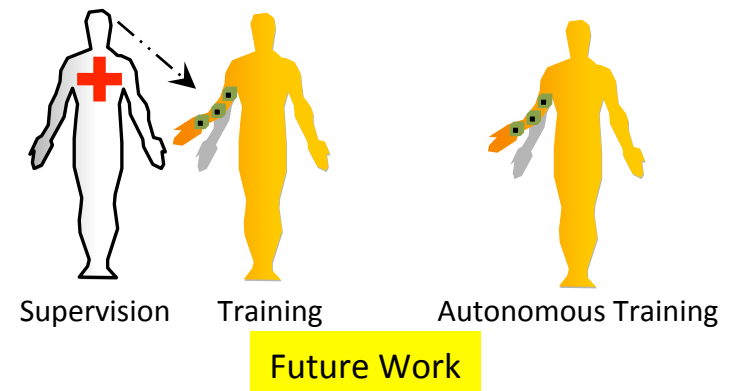
2. Coupled Training Device



3. Decoupled Training Device



4. Rehabilitation



Design Challenges

1. Sensor Node Platform

- Energy awareness
- Communication issues
- Sensor (acceleration)
- Flexibility



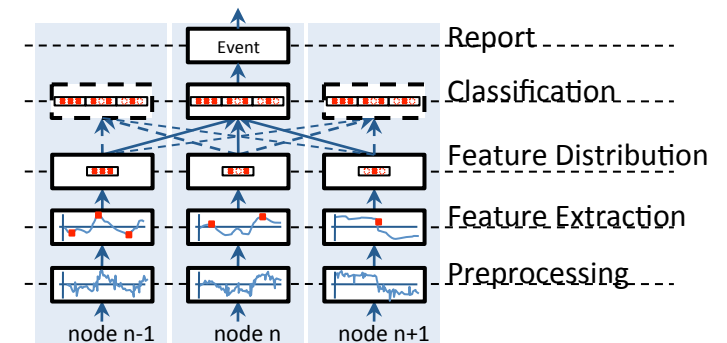
2. Housing

- Look & feel and usability
- Thin housing
- Integration of PCB-Shape & energy supply



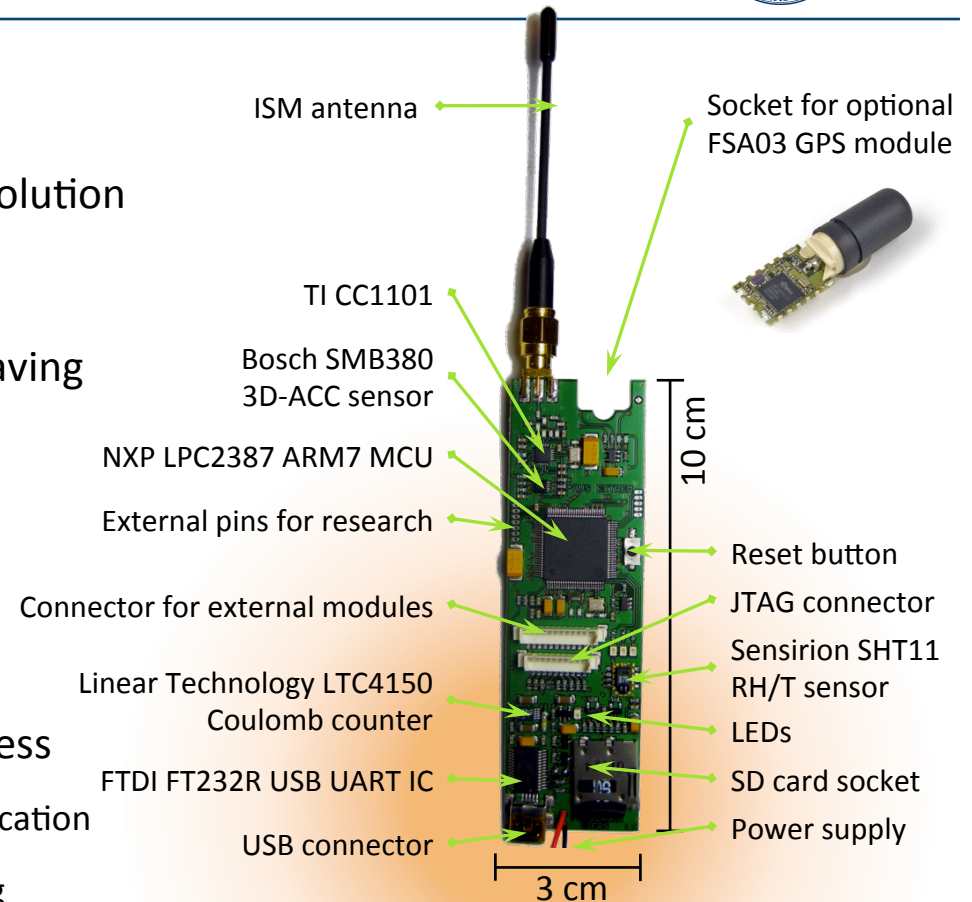
3. Event Detection

- Decentralized pattern recognition
- No dedicated infrastructure



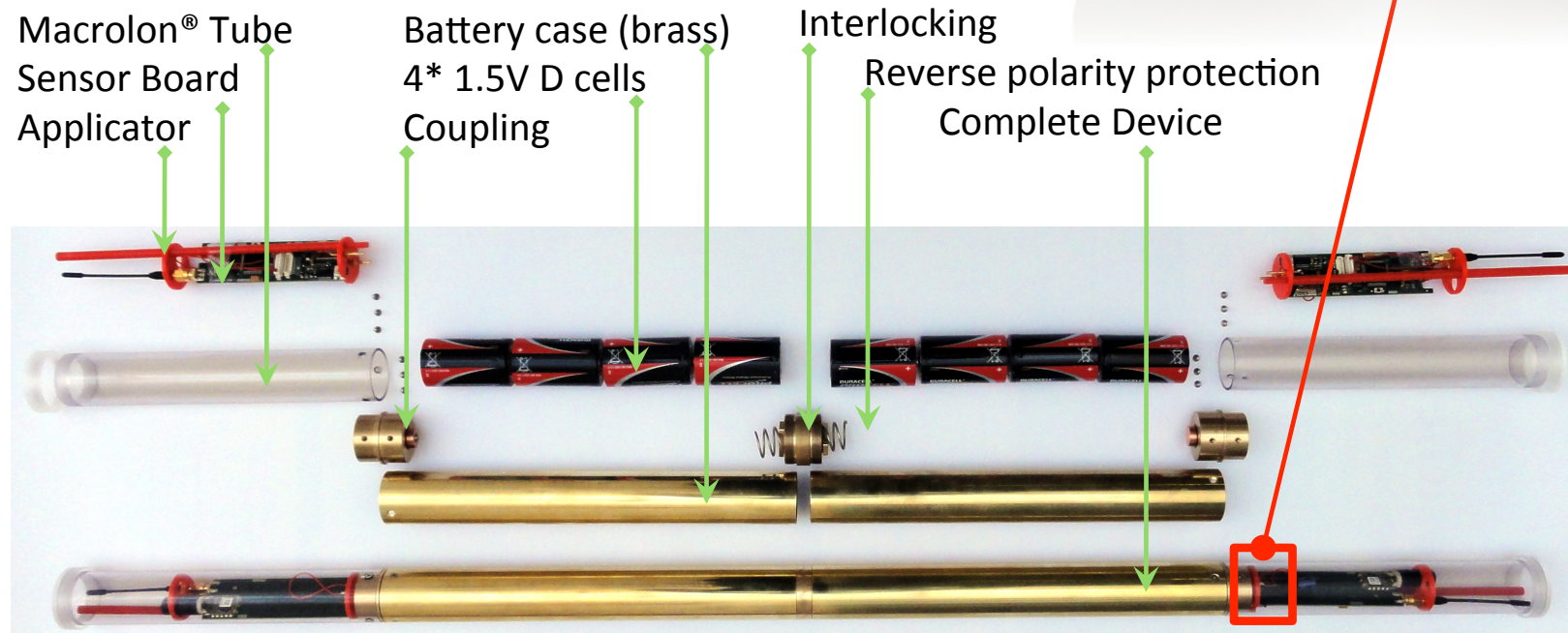
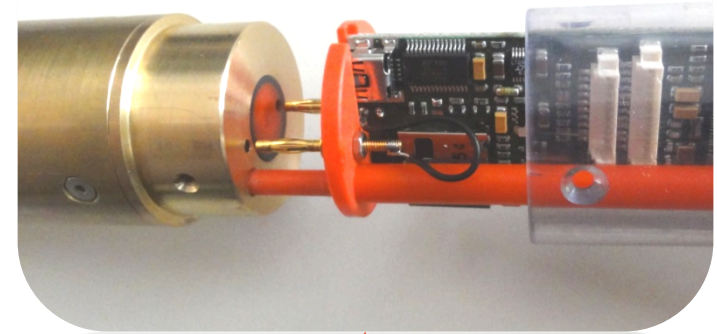
Hardware and Software Platform

- ARM7-MCU based architecture
- 3D-Acceleration sensor ($\pm 2g$, $\pm 4g$, $\pm 8g$), 10bit resolution
- 868 MHz CC1101 transceiver
- Interrupt driven OS FireKernel supports power saving
 - Wake On Radio for transceiver
 - ACC-Logic wakes up MCU **only** if necessary
 - IDLE-mode (int. Int.), Power Down (ext. Int.)
 - D cells : 16 days training / 250 days standby
- ACC-Data is buffered to enable time-delayed access
 - e.g. for varying algorithms for event analysis or classification
 - allows higher priorities for communication and routing
- Integrated Distributed Event Detection
 - Pattern recognition and in-network evaluation
 - Freely trainable system



Housing

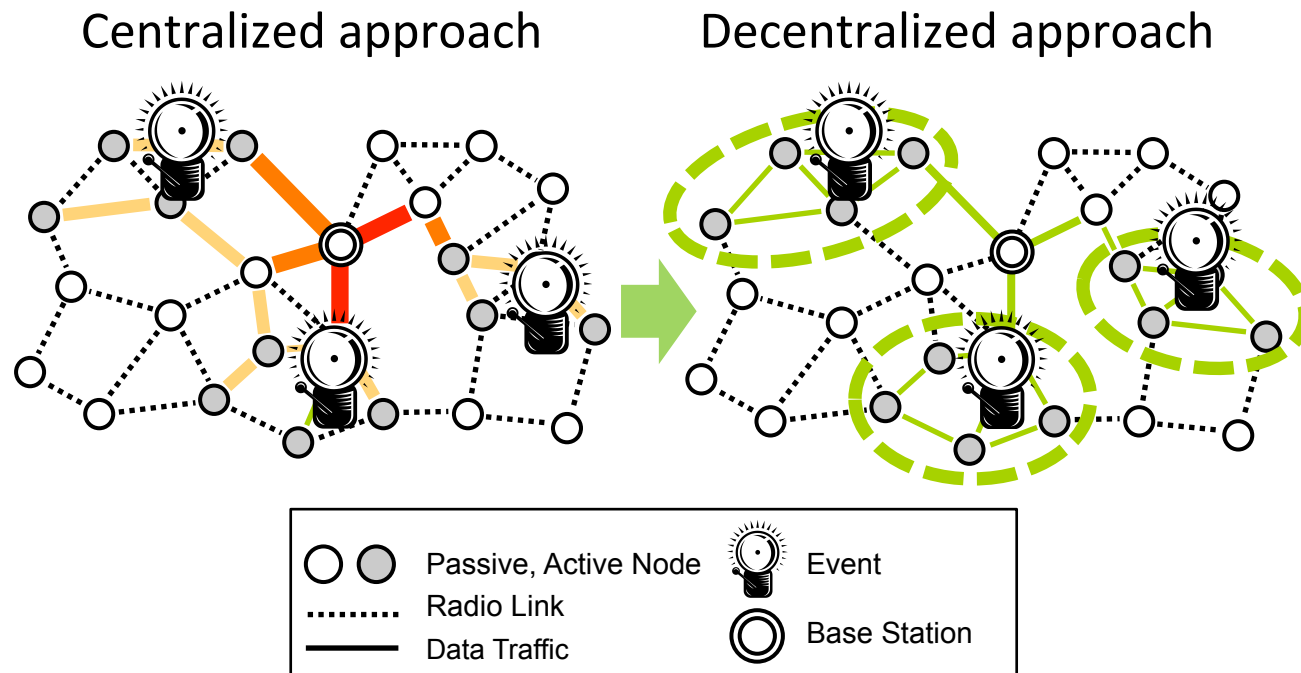
- Simple integration of sensor node
- Reverse polarity protection
- Splash proofed and robust housing
- Alternative power-supply possible
- Capacitor to bridge power supply with spring



Unassembled & Assembled Device

Distributed Event Detection

- *In-network data processing* is a key feature of Wireless Sensor Networks (WSNs)
 - **Time:** In-network evaluation of condensed data, transmitting results ONLY if needed => In-network decisions are possible
 - **Energy:** Reduce communication with base station => Extend network lifetime



Orientation & Strength Features

- Building of n intervals with k acceleration samples

- ACC-Values of all axis (x, y, z) are combined in a vector \vec{v}_i in Euclidean space \mathbb{R}^3 .

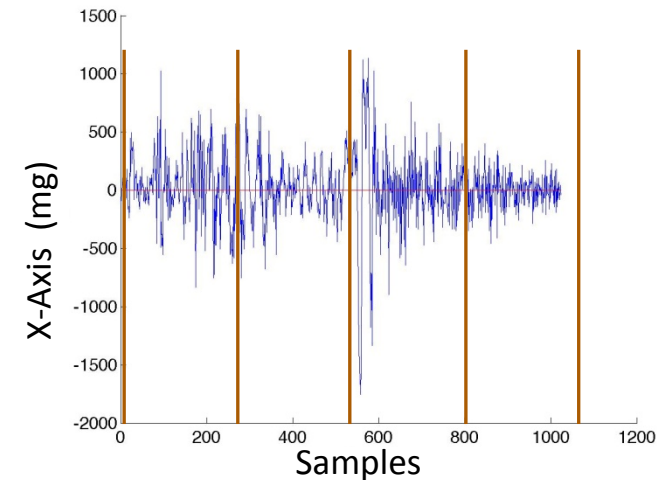
- All vectors \vec{v}_i of an interval are summed to the interval vector $\vec{v}_{int} = \vec{v}_1 + \vec{v}_2 + \dots + \vec{v}_k$

- Orientation Feature $\vec{o}_{int} = \frac{1}{\|\vec{v}_{int}\|} * \vec{v}_{int}$

- Describes physical orientation of all axis within a certain interval

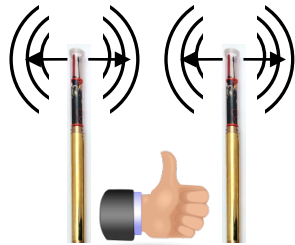
- Strength Feature $\|\vec{v}_{int}\| = \sqrt{\langle \vec{v}_{int}, \vec{v}_{int} \rangle} = \sqrt{x^2 + y^2 + z^2}$

- Describes the strength a person induces into the device

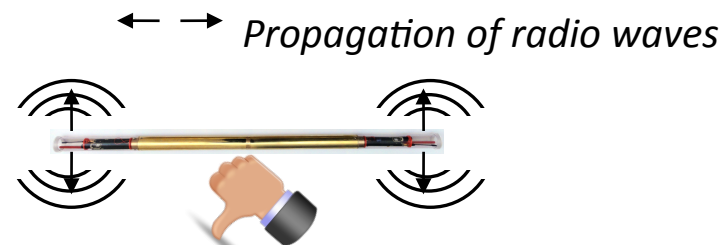


Leading Questions

- Latency/ Packet Delivery Ratio
 - Problems in communication due to horizontally aligned and omnidirectional antennas



vertically aligned antennas



horizontally aligned antennas may cause problems

- If latency is too high, uninterrupted training is not possible
 - Does antenna alignment..
 - Does moving the stick..
 - Does the environment..
 - Does Wake On Radio..
- } ..influence latency or PDR?

- Accuracy
 - Teacher and student are different persons, is detection still working?
 - Is there a training effect?

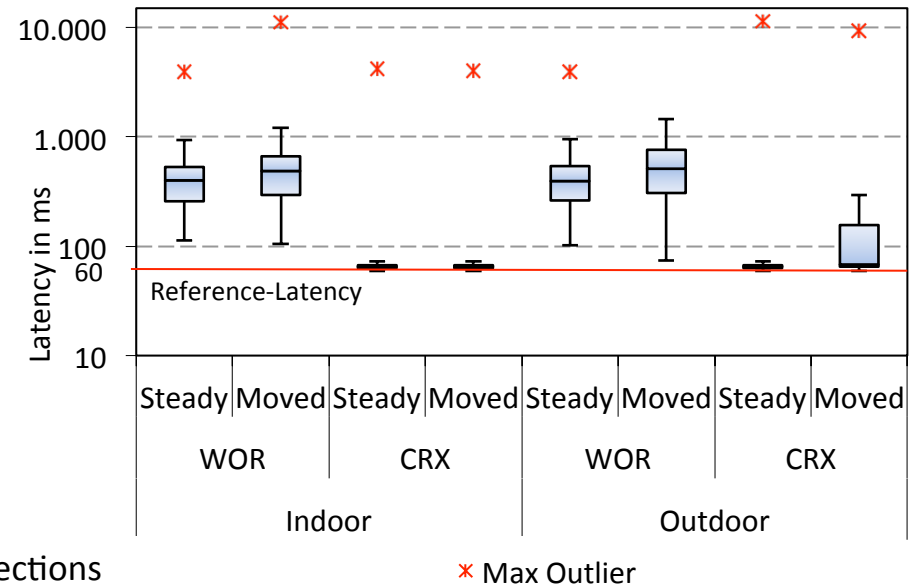
Latency / PDR: Experimental Setup

- Real-World experiment: transmit data between both nodes of device
- Measure RTT between embedded sensor nodes
 - RRT used to avoid focusing on MCU clock drift
 - 800 packets
- Varying parameters:
 - Moved device vs. steady device
 - Indoor vs. outdoor performance
 - Standard Receiver Mode vs. Wake On Radio
 - CRX: constant receiving mode ON
 - WOR: 542ms sleep, Wakeup 1ms

Latency / PDR: Experimental Results

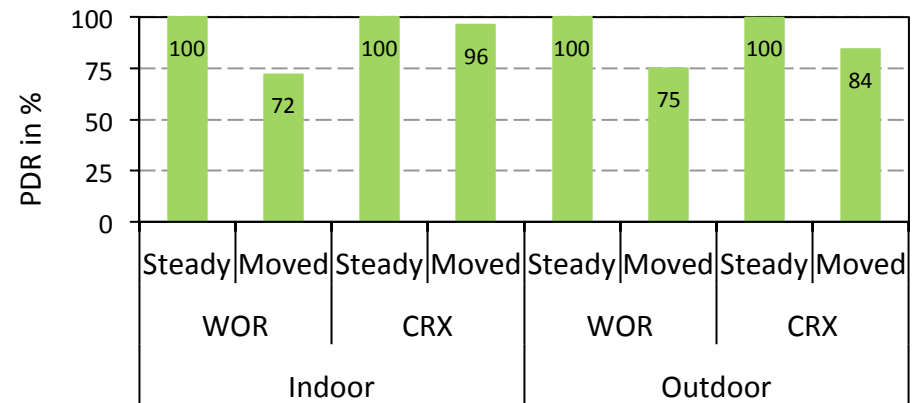
Latency

- Horizontally aligned antennas increase latency by 10 ms
- Movements increases latency by 130-230 ms
- WOR increases latency by 400-500 ms
- Outdoor application increases latency slightly
- Indoor application decreases latency because of more reflections



Packet Delivery Ratio (PDR)

- Movements cause packet loss
- In general: very high PDR
- CRX optimizes communication in indoor and outdoor areas



Movement Detection: Experimental Setup

- Training-Device trained by teacher
 - 20 times per technique, at 8g, 100Hz
- 6 techniques are trained (3 Strikes , 1 Block, 1 Stab, 1 Spin)
- Another person imitates the techniques about 50 times each
- LEDs give immediate feedback of performance quality



Strike a)



Strike b)



Block c)



Stab d)



Spin e)



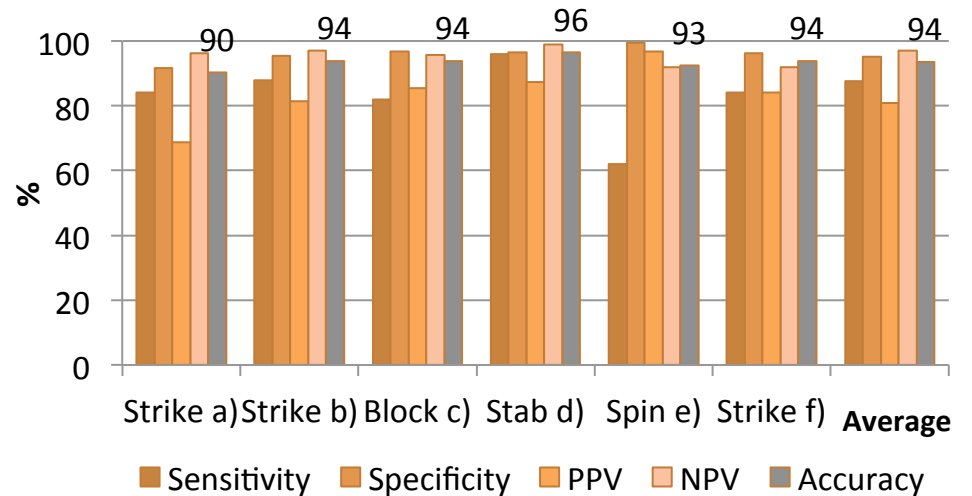
Strike f)



Green = Technique ok
Red = Technique wrong/bad
Blue = Sequence finished

Movement Detection: Experimental Results

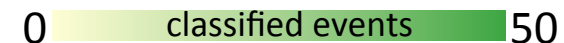
- All events reach an accuracy above 90%
 - Strike a) has low PPV: too many Strike a)
 - Spin e) has low Sensitivity: too few Spin e)
 - Strike b), Block c), Stab d) and Strike f) deliver high accuracy of at least 94 %
- Average accuracy of about 94%



- Principal diagonal is well-marked
 - Strike a) has good characteristics but classifies itself as all other classes at least once
 - Spin e) is often classified as Strike a)
- Detection accuracy is also user-dependent
- Errors can easily be detected by the motion-based training device

		Classes to detect					
		Strike a)	Strike b)	Block c)	Stab d)	Spin e)	Strike f)
Classes detected	Strike a)	42				19	
	Strike b)	1	44	4			5
	Block c)	1	1	41	2		3
	Stab d)	1	5	1	48		
	Spin e)	1				31	
	Strike f)	4		4			42

Confusion matrix

0  50
classified events

Conclusion:

- Distributed Event Detection enhances training devices to supervising and independent devices
- Activating WOR and performing training outdoors increases latency and decreases PDR
- Communication is stable and suitable by applying CRX at indoor environments
- Training device improves user skills, as errors are detected
- Training with device simply makes fun => it motivates

Future Work:

- Housing made of Krüpx
- New application scenarios
 - Decoupled devices
 - Rehabilitation
 - Surveillance of buildings (bridges, skyscraper...)

Watch Demo:

<http://cst.mi.fu-berlin.de/projects/AVS-Extrem>

