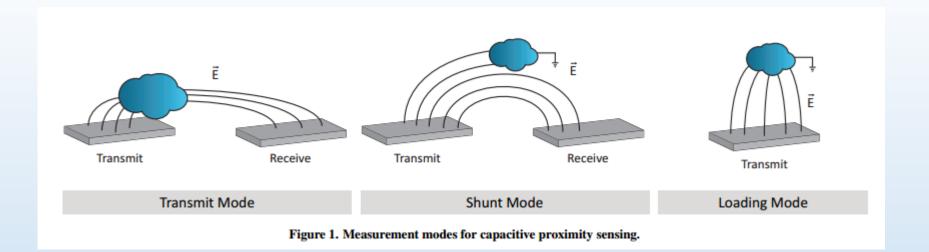
Overview of Capacitive Sensing Applications

Aein Rezaei



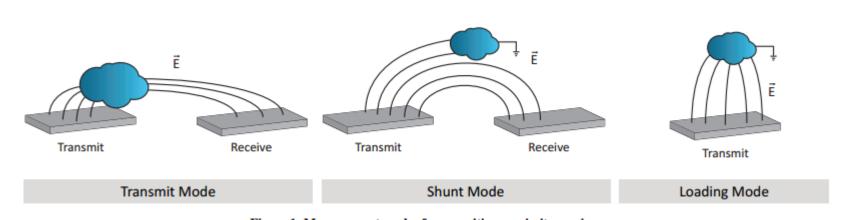
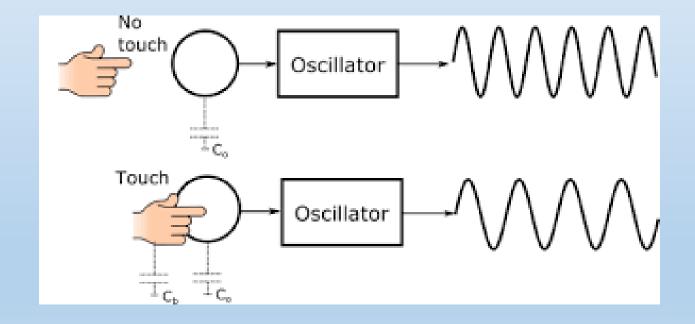


Figure 1. Measurement modes for capacitive proximity sensing.

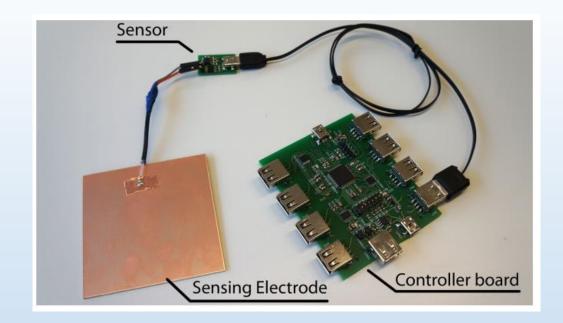


Hardware

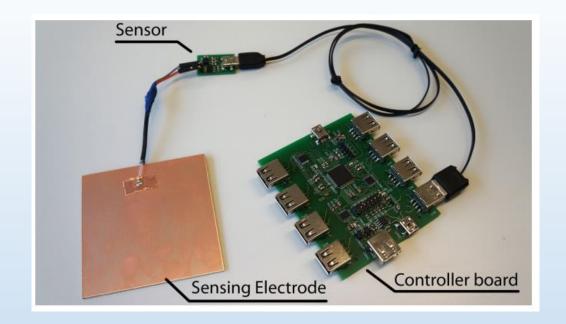


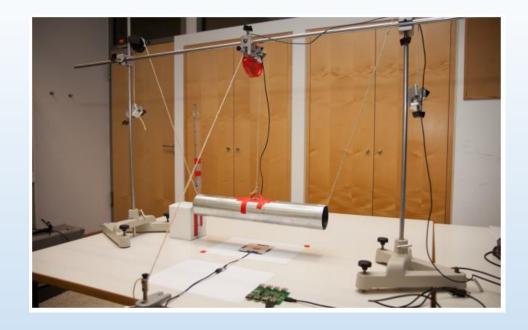


[2] Wimmer, R., Kranz, M., Boring, S. and Schmidt, A., 2007, March. A capacitive sensing toolkit for pervasive activity detection and recognition. In *Pervasive Computing and Communications*, 2007. *PerCom'07*. *Fifth Annual IEEE International Conference on* (pp. 171-180). IEEE.

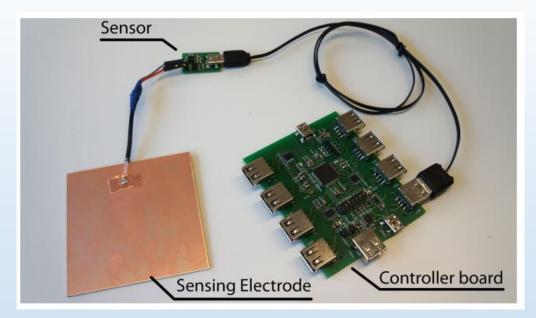


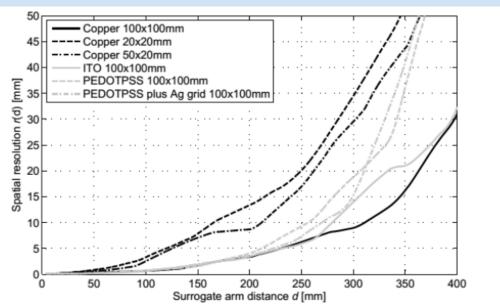
[3] T. Grosse-Puppendahl, Y. Berghoefer, A. Braun, R. Wimmer, and A. Kuijper, "OpenCapSense: A Rapid Prototyping Toolkit for Pervasive Interaction Using Capacitive Sensing," in *Proceedings PerCom*, 2013, pp. 152 – 159.

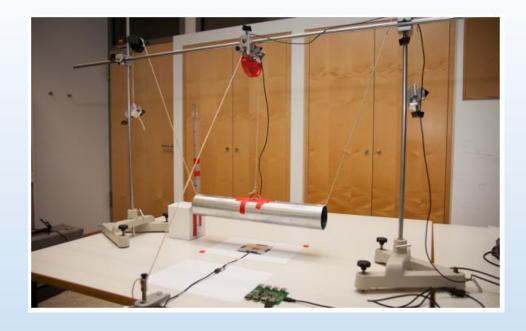




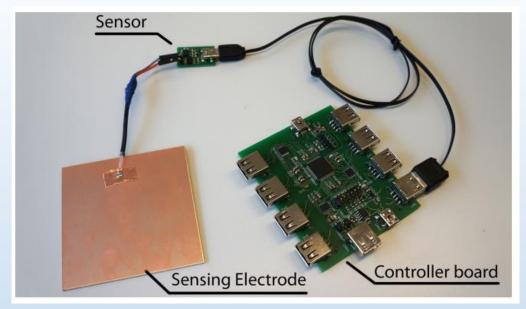
[3] T. Grosse-Puppendahl, Y. Berghoefer, A. Braun, R. Wimmer, and A. Kuijper, "OpenCapSense: A Rapid Prototyping Toolkit for Pervasive Interaction Using Capacitive Sensing," in *Proceedings PerCom*, 2013, pp. 152 – 159.

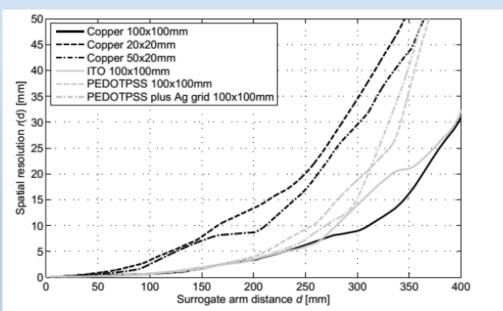


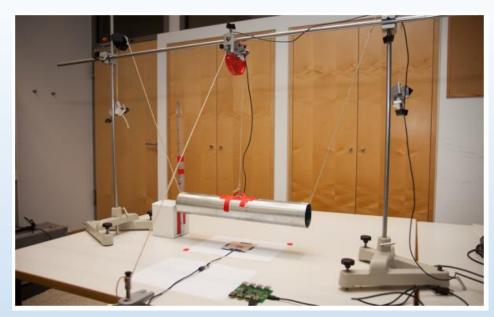


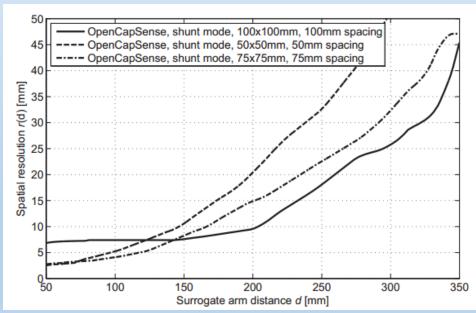


[3] T. Grosse-Puppendahl, Y. Berghoefer, A. Braun, R. Wimmer, and A. Kuijper, "OpenCapSense: A Rapid Prototyping Toolkit for Pervasive Interaction Using Capacitive Sensing," in *Proceedings PerCom*, 2013, pp. 152 – 159.

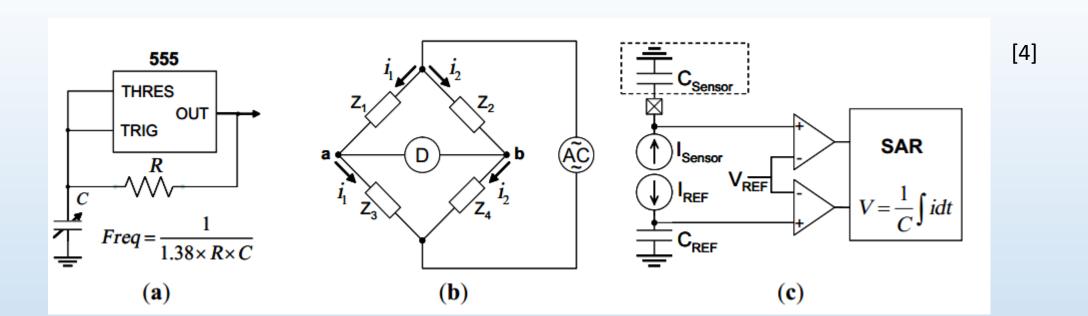




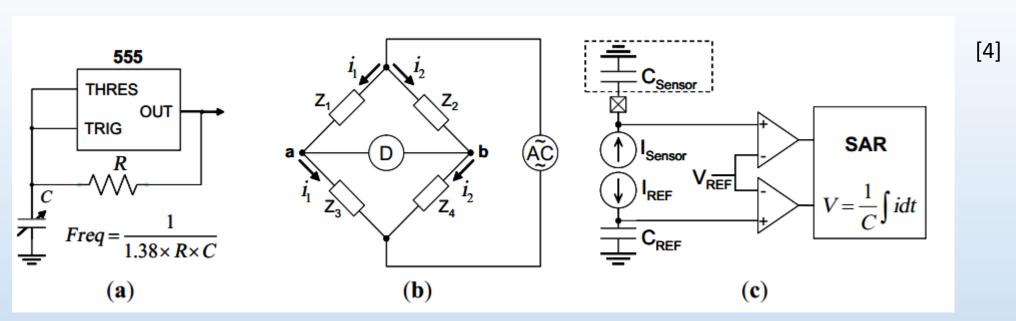


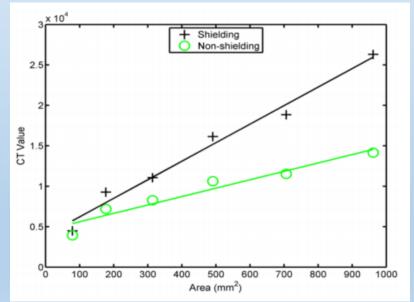


[3] T. Grosse-Puppendahl, Y. Berghoefer, A. Braun, R. Wimmer, and A. Kuijper, "OpenCapSense: A Rapid Prototyping Toolkit for Pervasive Interaction Using Capacitive Sensing," in *Proceedings PerCom*, 2013, pp. 152 – 159.

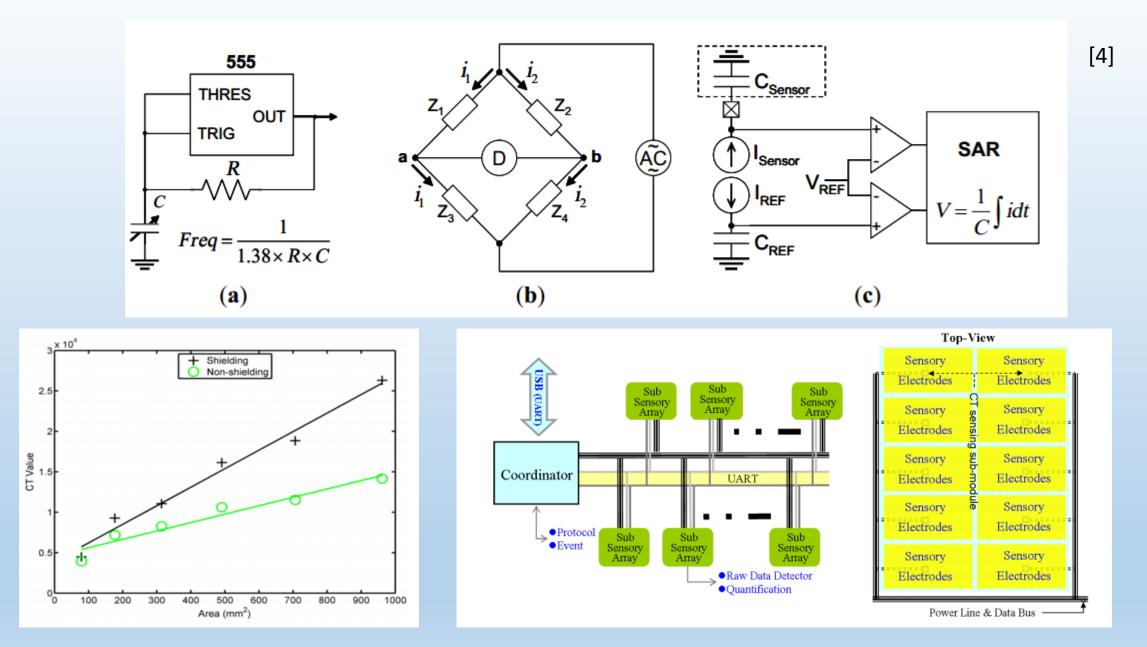


[4]Chang, Wen-Ying, Chi-Chun Chen, Chih-Cheng Chang, and Chin-Lung Yang. "An enhanced sensing application based on a flexible projected capacitive-sensing mattress." *Sensors* 14, no. 4 (2014): 6922-6937.

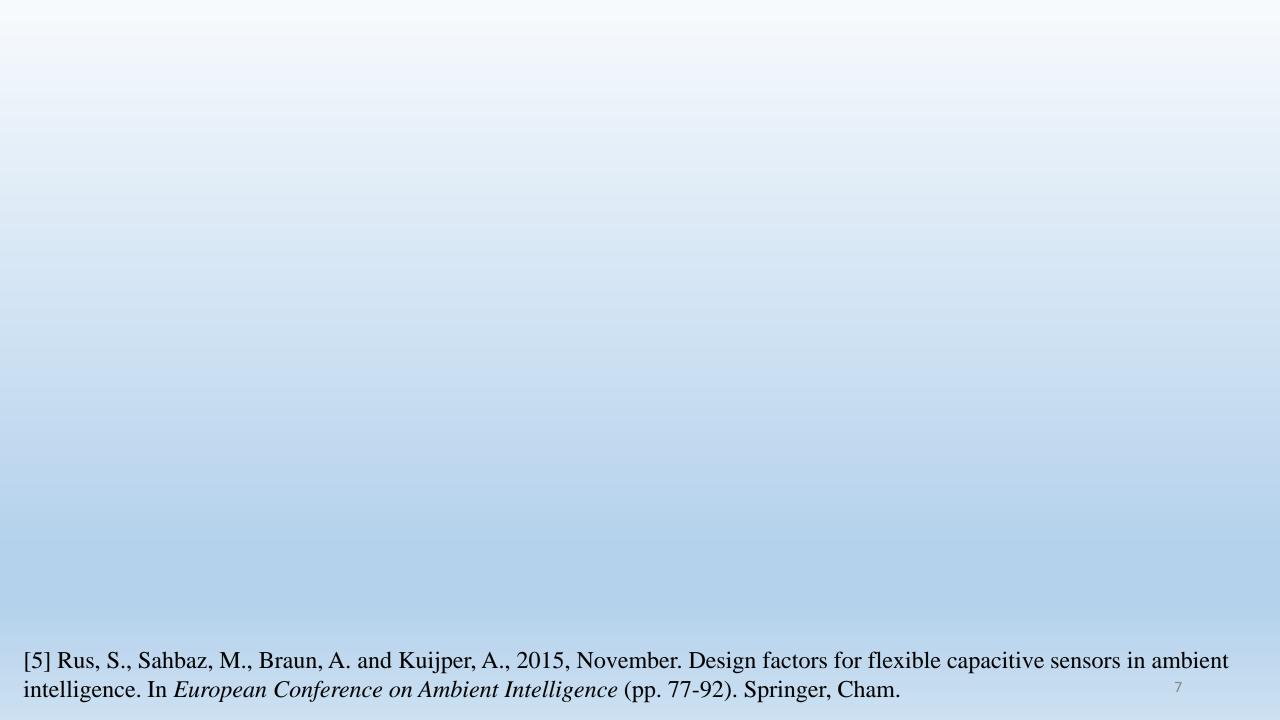




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[5] Rus, S., Sahbaz, M., Braun, A. and Kuijper, A., 2015, November. Design factors for flexible capacitive sensors in ambient intelligence. In *European Conference on Ambient Intelligence* (pp. 77-92). Springer, Cham.

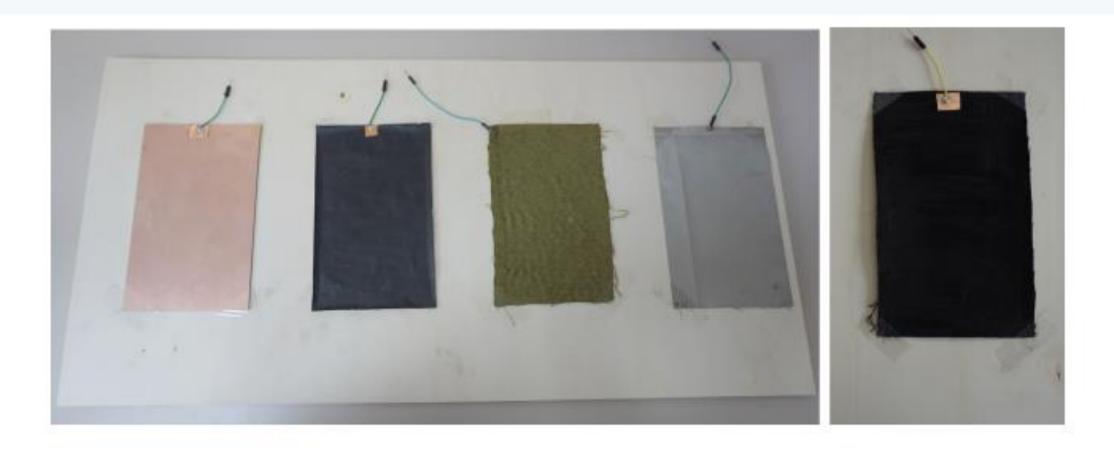


Fig. 2. Electrode materials samples of same size used in self capacitance measurement mode: (from left to right) copper electrode, conductive paint, conductive thread, conductive fabric, conductive paint on fabric

[5] Rus, S., Sahbaz, M., Braun, A. and Kuijper, A., 2015, November. Design factors for flexible capacitive sensors in ambient intelligence. In *European Conference on Ambient Intelligence* (pp. 77-92). Springer, Cham.

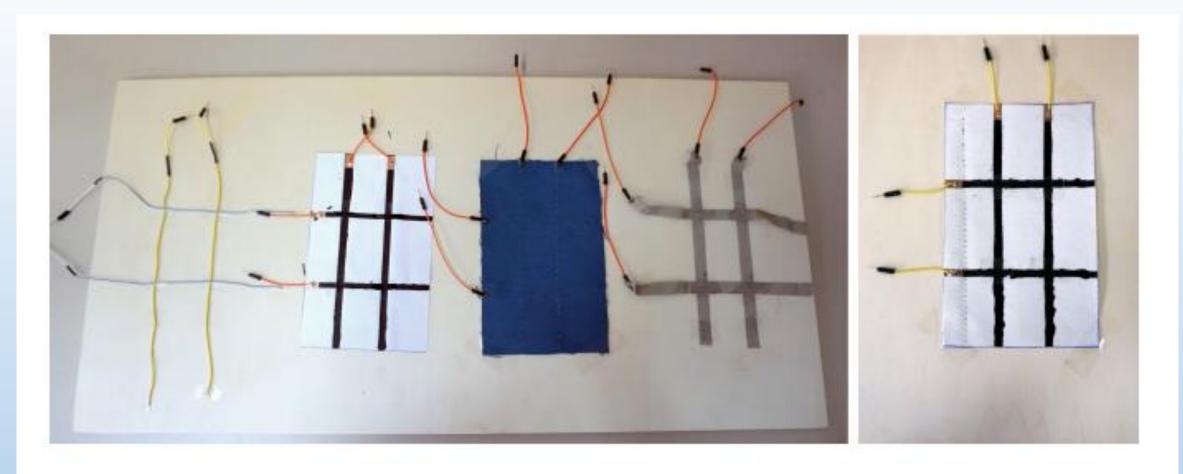
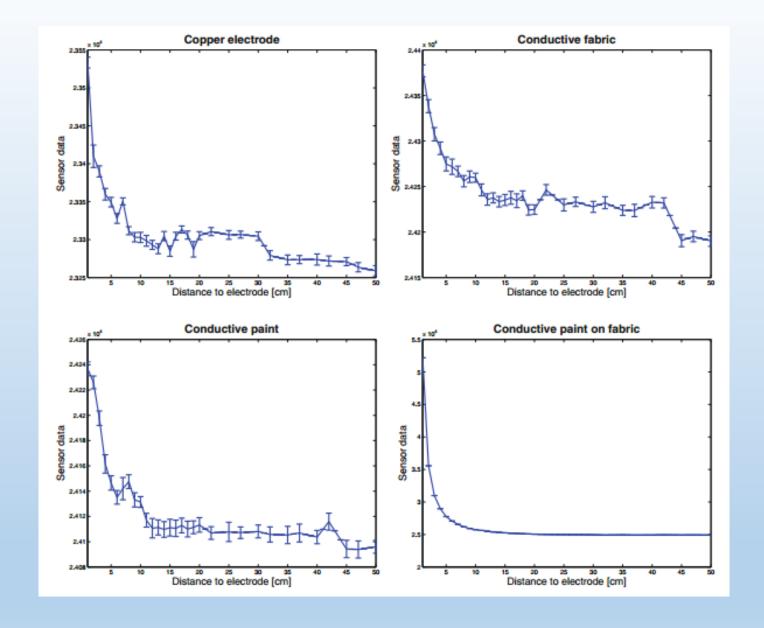
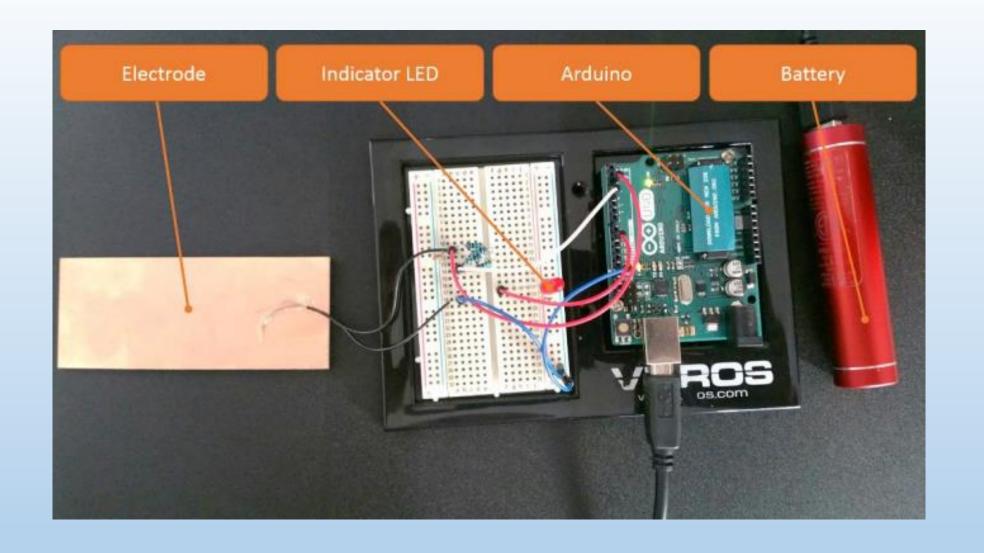


Fig. 3. Electrode material samples of same size used in mutual capacitance measurement mode:(from left to right) copper wires, conductive paint, conductive thread, conductive fabric, conductive paint on fabric

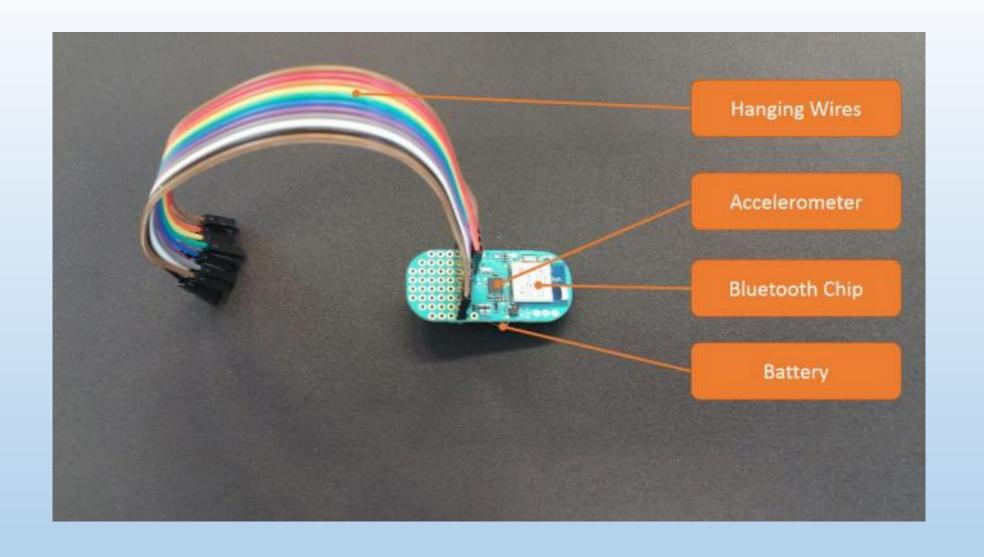
[5] Rus, S., Sahbaz, M., Braun, A. and Kuijper, A., 2015, November. Design factors for flexible capacitive sensors in ambient intelligence. In *European Conference on Ambient Intelligence* (pp. 77-92). Springer, Cham.



[5] Rus, S., Sahbaz, M., Braun, A. and Kuijper, A., 2015, November. Design factors for flexible capacitive sensors in ambient intelligence. In *European Conference on Ambient Intelligence* (pp. 77-92). Springer, Cham.



[6] Braun, A., Majewski, M., Wichert, R. and Kuijper, A., 2016, July. Investigating low-cost wireless occupancy sensors for beds. In *International Conference on Distributed, Ambient, and Pervasive Interactions* (pp. 26-34). Springer International Publishing.



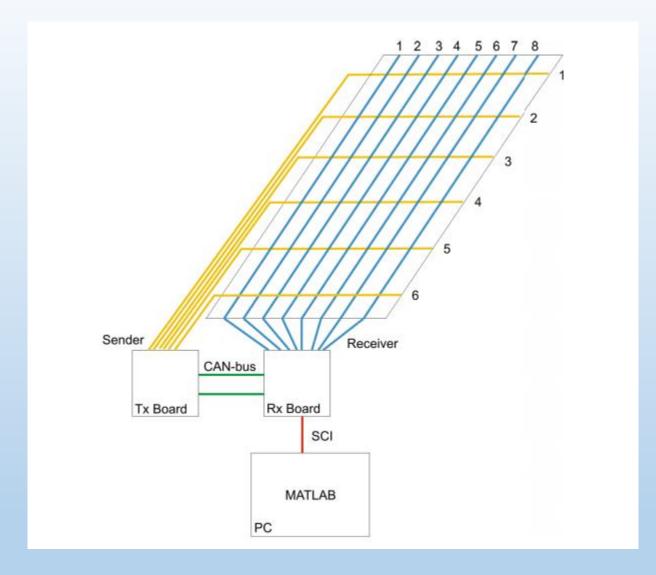
[6] Braun, A., Majewski, M., Wichert, R. and Kuijper, A., 2016, July. Investigating low-cost wireless occupancy sensors for beds. In *International Conference on Distributed, Ambient, and Pervasive Interactions* (pp. 26-34). Springer International Publishing.

Table 1 Results of evaluations one and two with five different objects and 2-10 users

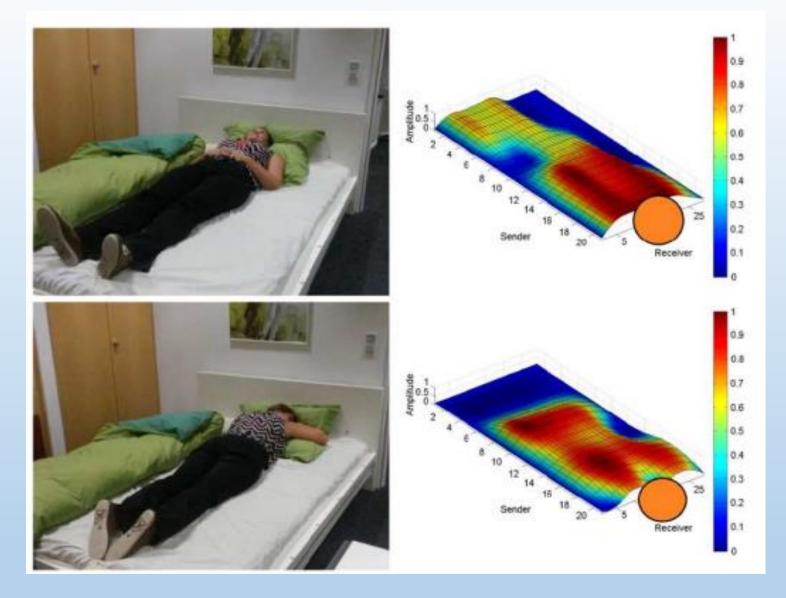
Object	No. samples	Recall Accelerome-	Recall Capacitive	
		ter		
Office chair	20	90%	85%	
Wooden chair	20	55%	100%	
Wheel chair	20	85%	85%	
Bed #1	20	75%	95%	
Bed #2	20	50%	90%	
Bed #1 (10 users)	200	91%	96%	
Bed #2 (10 users)	200	79%	93%	

[6] Braun, A., Majewski, M., Wichert, R. and Kuijper, A., 2016, July. Investigating low-cost wireless occupancy sensors for beds. In *International Conference on Distributed, Ambient, and Pervasive Interactions* (pp. 26-34). Springer International Publishing.

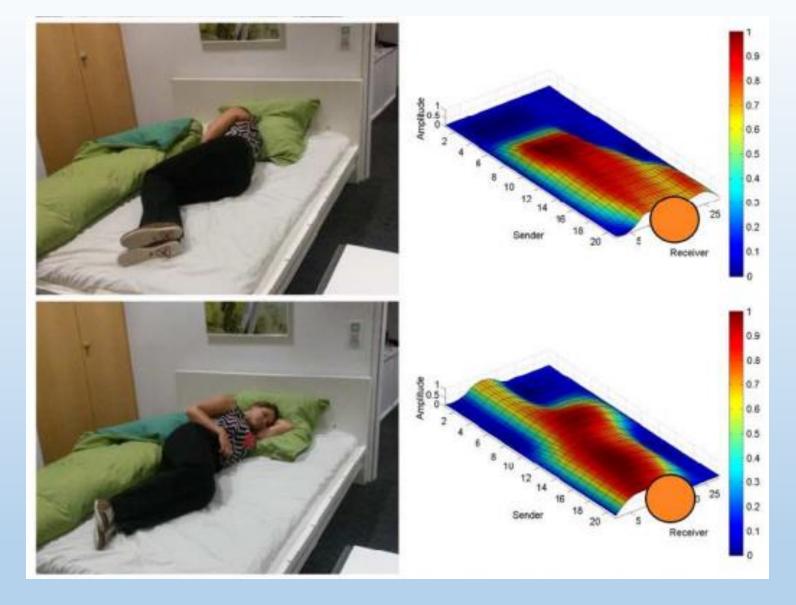
Smart Bed



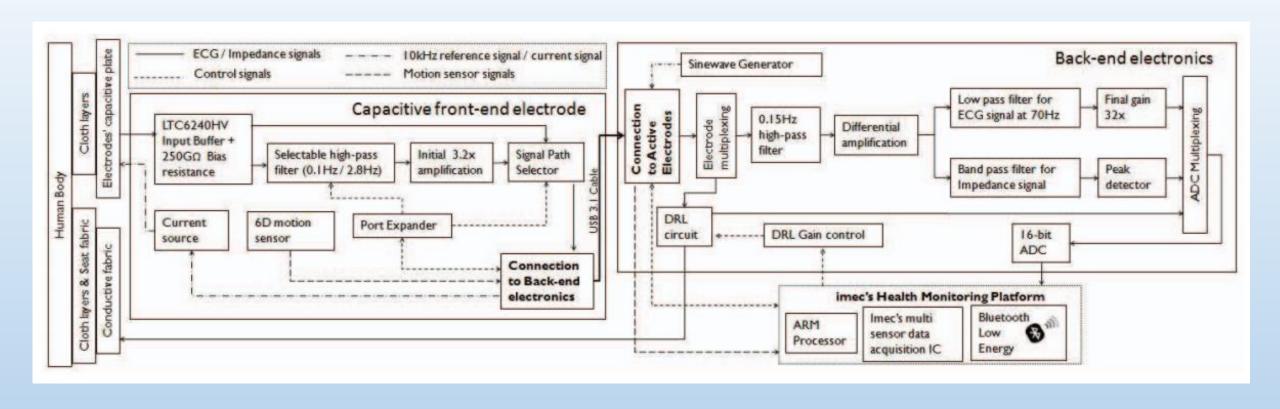
[7] Rus, S., Grosse-Puppendahl, T. and Kuijper, A., 2014, November. Recognition of bed postures using mutual capacitance sensing. In *European Conference on Ambient Intelligence* (pp. 51-66). Springer, Cham. [8] Rus, S., Grosse-Puppendahl, T. and Kuijper, A., 2017. Evaluating the recognition of bed postures using mutual capacitance sensing. *Journal of Ambient Intelligence and Smart Environments*, 9(1), pp.113-127.



[7] Rus, S., Grosse-Puppendahl, T. and Kuijper, A., 2014, November. Recognition of bed postures using mutual capacitance sensing. In *European Conference on Ambient Intelligence* (pp. 51-66). Springer, Cham. [8] Rus, S., Grosse-Puppendahl, T. and Kuijper, A., 2017. Evaluating the recognition of bed postures using mutual capacitance sensing. *Journal of Ambient Intelligence and Smart Environments*, 9(1), pp.113-127.

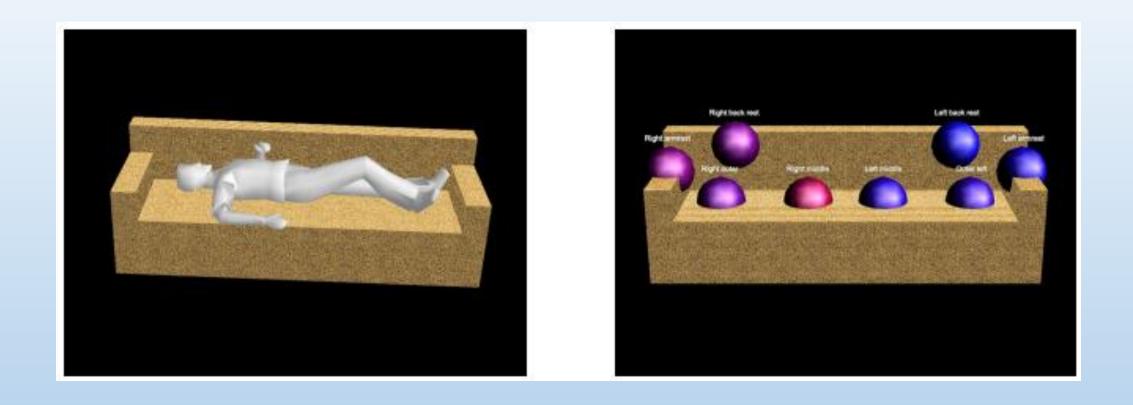


[7] Rus, S., Grosse-Puppendahl, T. and Kuijper, A., 2014, November. Recognition of bed postures using mutual capacitance sensing. In *European Conference on Ambient Intelligence* (pp. 51-66). Springer, Cham. [8] Rus, S., Grosse-Puppendahl, T. and Kuijper, A., 2017. Evaluating the recognition of bed postures using mutual capacitance sensing. *Journal of Ambient Intelligence and Smart Environments*, 9(1), pp.113-127.



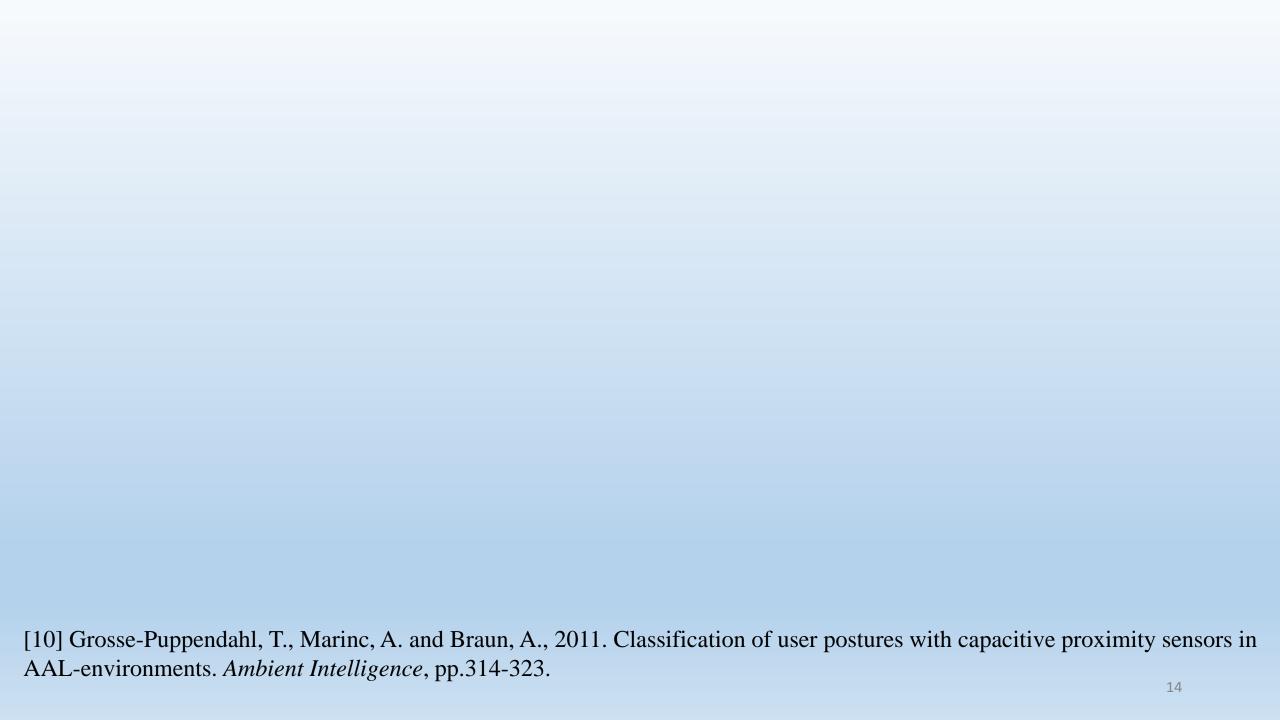
[9] Castro, I.D., Morariu, R., Torfs, T., Van Hoof, C. and Puers, R., 2016, May. Robust wireless capacitive ECG system with adaptive signal quality and motion artifact reduction. In *Medical Measurements and Applications (MeMeA), 2016 IEEE International Symposium on* (pp. 1-6). IEEE.

Smart Chair



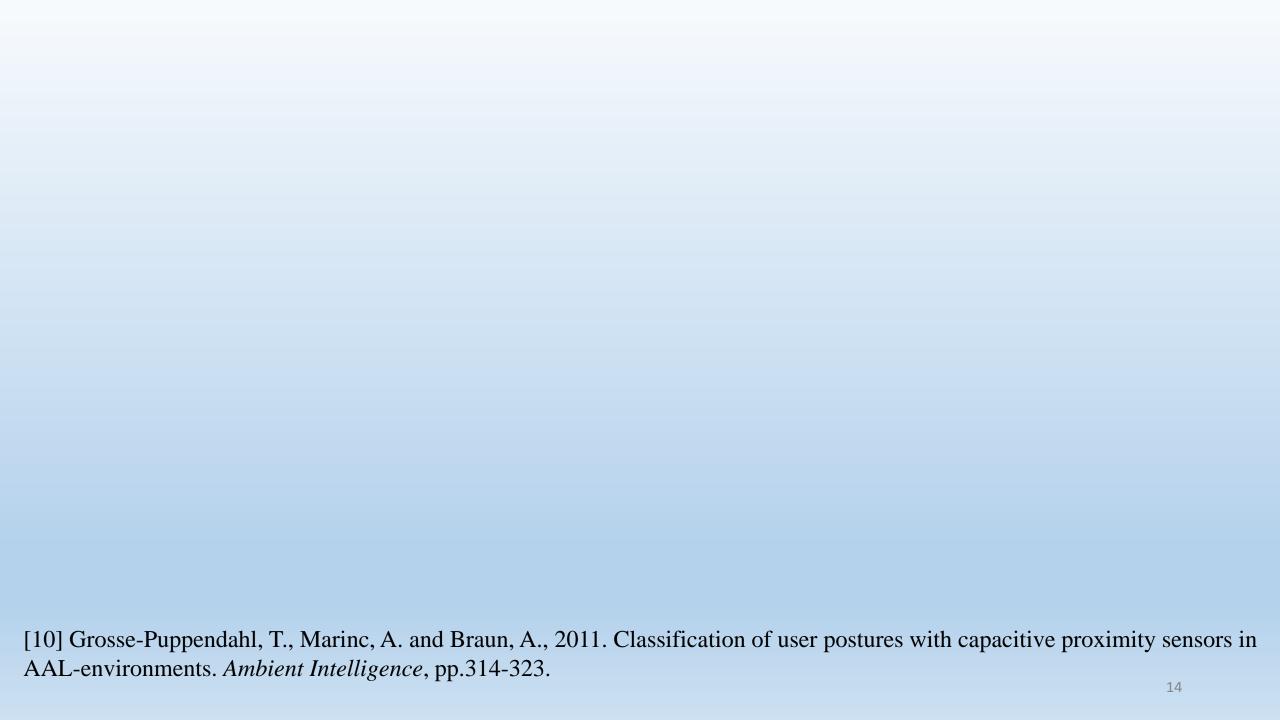
[10] Grosse-Puppendahl, T., Marinc, A. and Braun, A., 2011. Classification of user postures with capacitive proximity sensors in AAL-environments. *Ambient Intelligence*, pp.314-323.

14



	Naïv	e Bayes	Decis	sion Trees	RBF	network
Class	Prec	Rec	Prec	Rec	Prec	Rec
sitting outer left one person : OL	0.92	0.97	1.0	0.84	1.0	0.99
sitting middle left one person : ML	0.99	0.60	0.99	0.90	0.98	0.88
sitting outer right one person : OR	1.0	0.78	1.0	0.63	1.0	0.96
sitting middle right one person : MR	0.96	0.93	0.93	1.0	1.0	0.95
lying head right one person : LR	0.77	1.0	1.0	0.89	0.92	1.0
lying head left one person : LL	0.85	1.0	0.7	0.95	0.98	0.99
two persons sitting together : TT	0.77	1.0	0.95	1.0	0.87	1.0
two persons sitting gap : TG	1.0	0.99	0.98	0.64	1.0	0.99
no person : NP	1.0	0.92	0.66	1.00	1.0	1.0
Weighted average	0.92	0.91	0.91	0.87	0.98	0.97

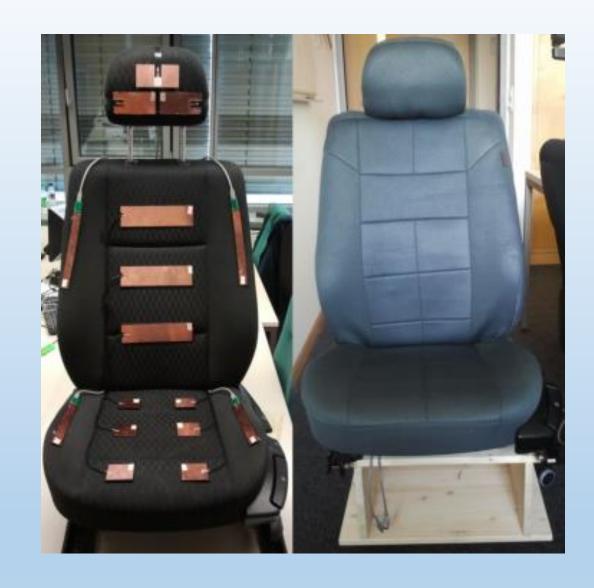
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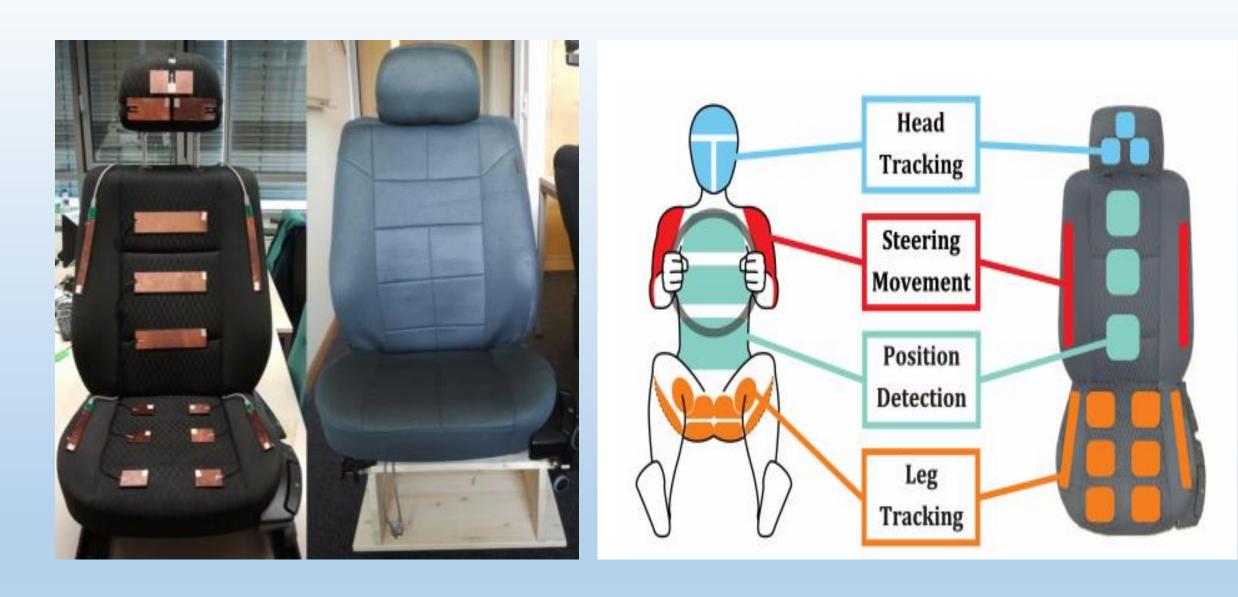
	OL	ML	OR	MR	LR	LL	TT	\mathbf{TG}	NP	Prec	Rec
sitting outer left one person : OL	296	1	0	0	0	2	1	0	0	0.99	0.987
sitting middle left one person : ML	3	227	0	0	0	0	28	0	0	0.983	0.88
sitting outer right one person : OR	0	0	253	0	11	0	0	0	0	1.0	0.958
sitting middle right one person : MR	0	0	0	243	12	0	0	0	0	1.0	0.953
lying head right one person : LR	0	0	0	0	260	0	0	0	0	0.919	1.0
lying head left one person : LL	0	3	0	0	0	254	0	0	0	0.981	0.988
two persons sitting together : TT	0	0	0	0	0	0	197	0	0	0.872	1.0
two persons sitting gap : TG	0	0	0	0	0	3	0	212	0	1.0	0.986
no person : NP	1	0	0	0	0	0	0	0	306	1.0	1.0
Table 2 Confusion mate	i c	. 41	DDI	7			_:c_	-	•	•	-

Table 2. Confusion matrix for the RBF network classifier

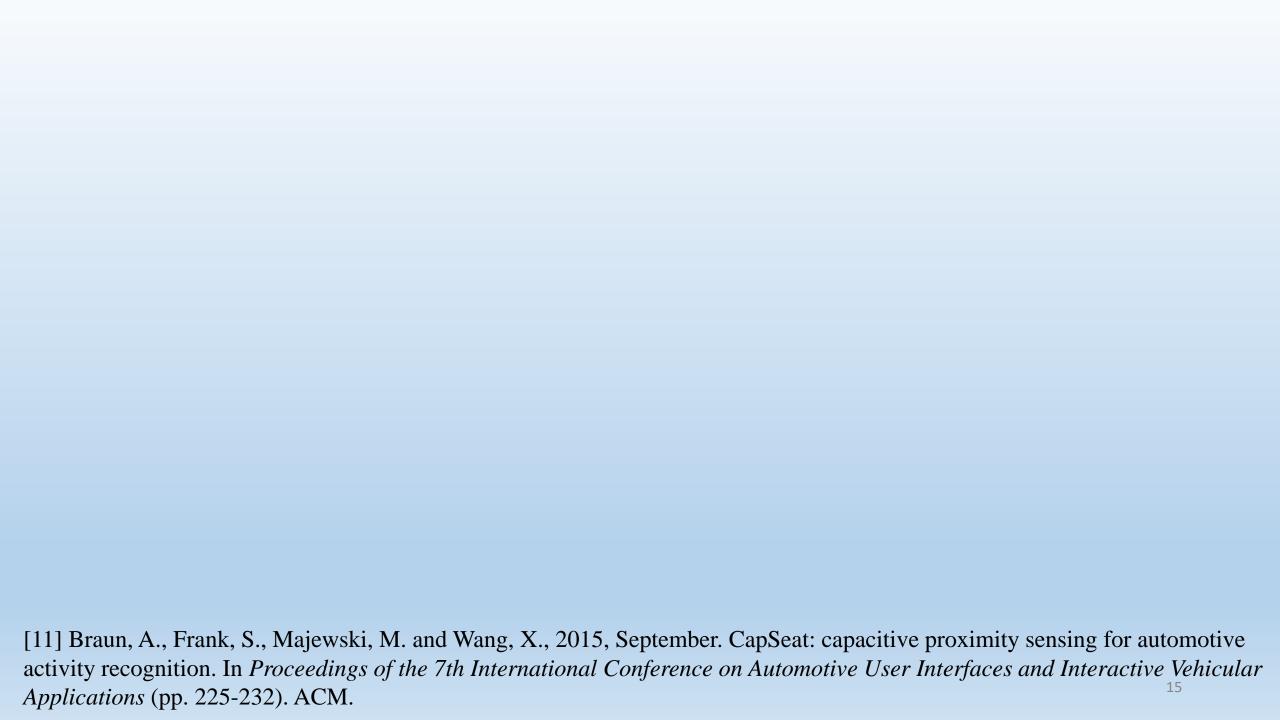
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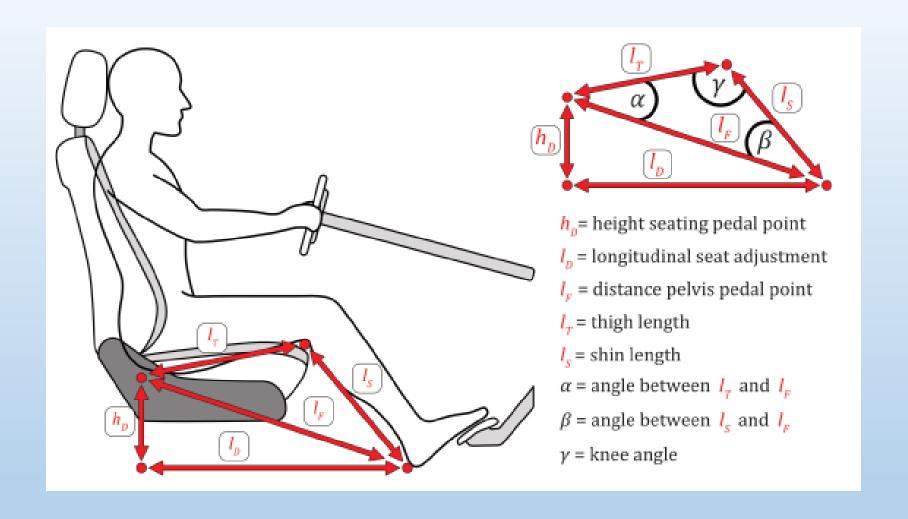


[11] Braun, A., Frank, S., Majewski, M. and Wang, X., 2015, September. CapSeat: capacitive proximity sensing for automotive activity recognition. In *Proceedings of the 7th International Conference on Automotive User Interfaces and Interactive Vehicular Applications* (pp. 225-232). ACM.



[11] Braun, A., Frank, S., Majewski, M. and Wang, X., 2015, September. CapSeat: capacitive proximity sensing for automotive activity recognition. In *Proceedings of the 7th International Conference on Automotive User Interfaces and Interactive Vehicular Applications* (pp. 225-232). ACM.





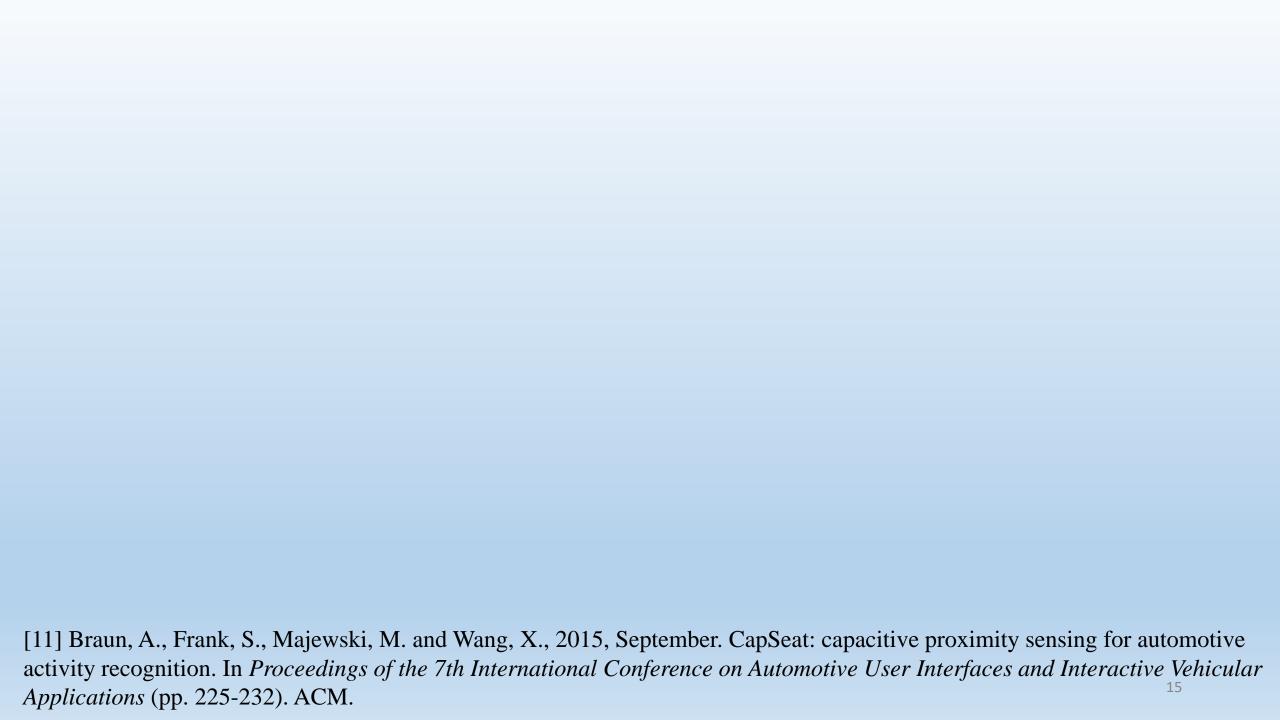
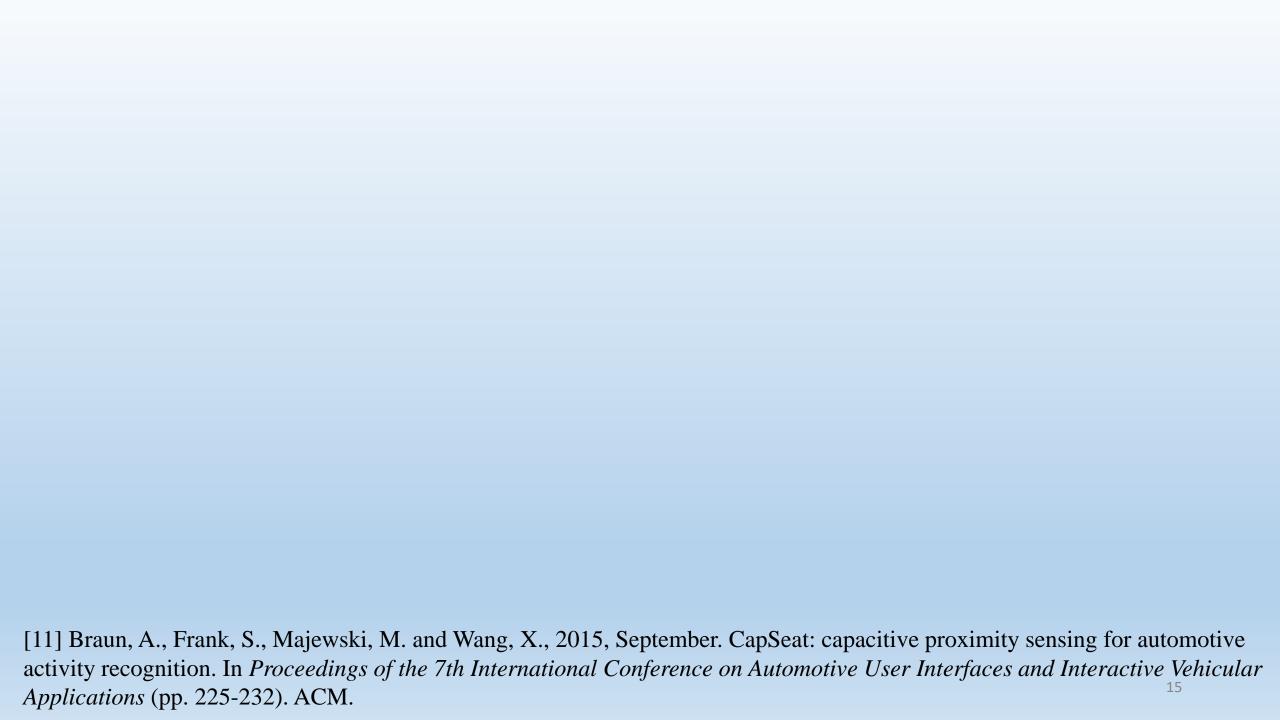


Table 1. Overview of processing methods of CapSeat								
Property Method		Features	Result					
Occupancy	Multiclass SVM	All sensors	Three classes: Empty, foreign object, person					
Driver posture	Binary SVM	All sensors	Two classes: Upright, not upright					
Head rest adjustment	Multiclass SVM	Three head rest sensors	Three classes: Correct, too low, too high					
Seating adjustment	Value ratio	Sensors below knee	Knee angle in degrees					
Back rest adjustment	Multiclass SVM	Two pelvis sensors, all back rest sensors	Three classes: Correct, too far back, too far front					
Comfort adjustment	Value ratio	Seating sensors, back rest sensors	Balance of proximity distribution					
Head posture	Multiclass SVM	Three head rest sensors	Three classes: Correct, whiplash area, airbag zone					
Steering velocity	Binary SVM	Back rest sensors - value and deriva- tive	Two classes: Too high, normal					
Yawn detection	Binary SVM	Single upper back sensor - frequency spectrum	Two classes: Yawn, breathe					
Nod detection	Binary SVM	Three head rest sensors - derivative values over time	Two classes: Nod, no nod					
Gaze detection	Multiclass SVM	Three head rest sensors	Six classes: No gaze, down, up, left, right, straight					



Driver seat

Steering wheel

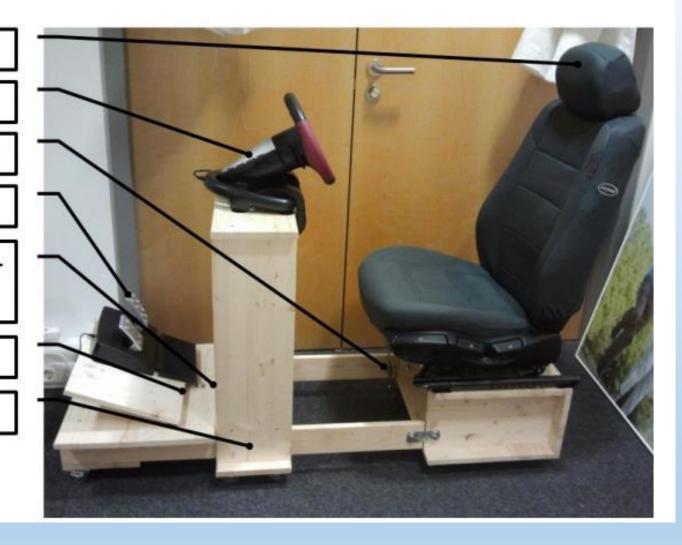
USB connectors

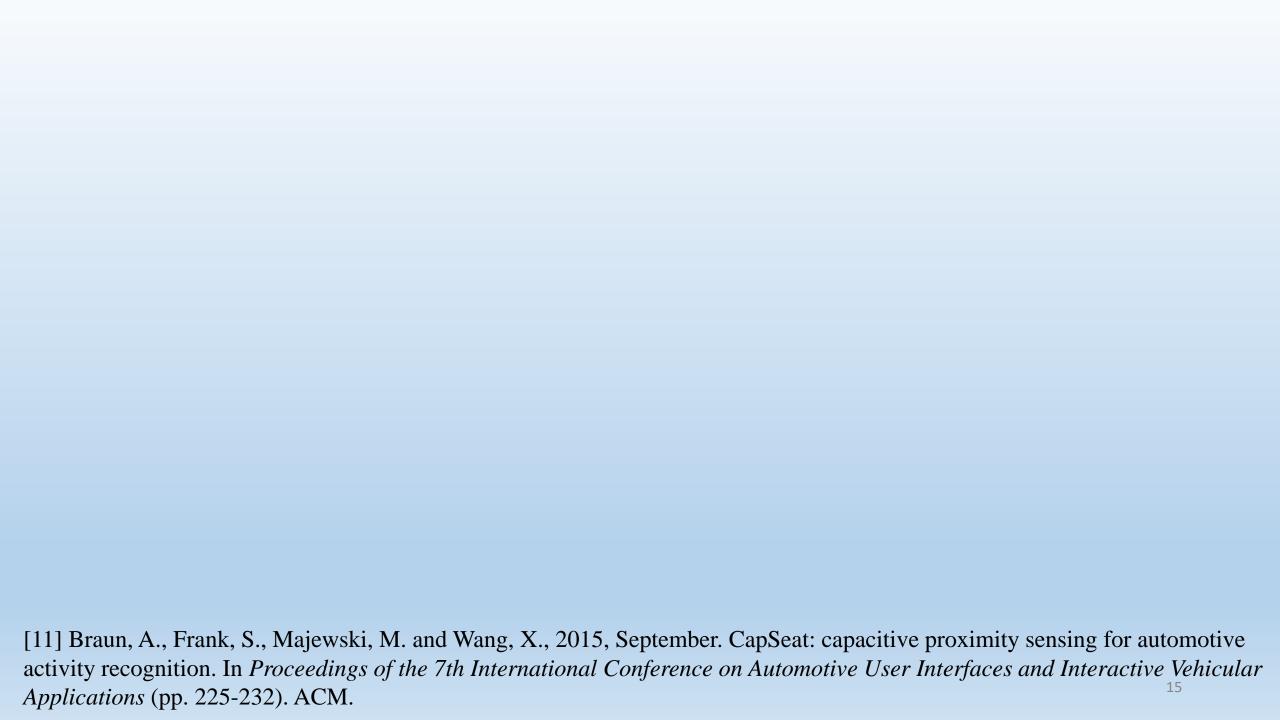
Pedals

Adjustable pedalsteering unit

Revolute joint

Prismatic joint





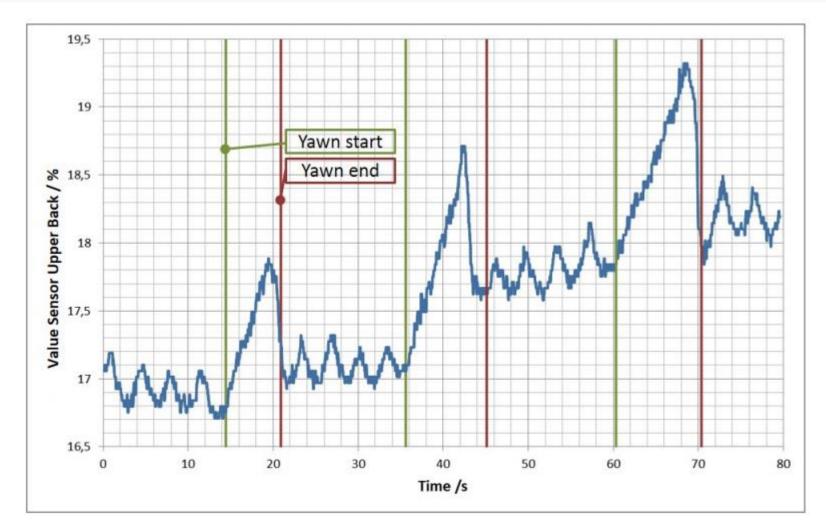


Figure 5. Values of upper back sensor during regular breathing and three yawn events

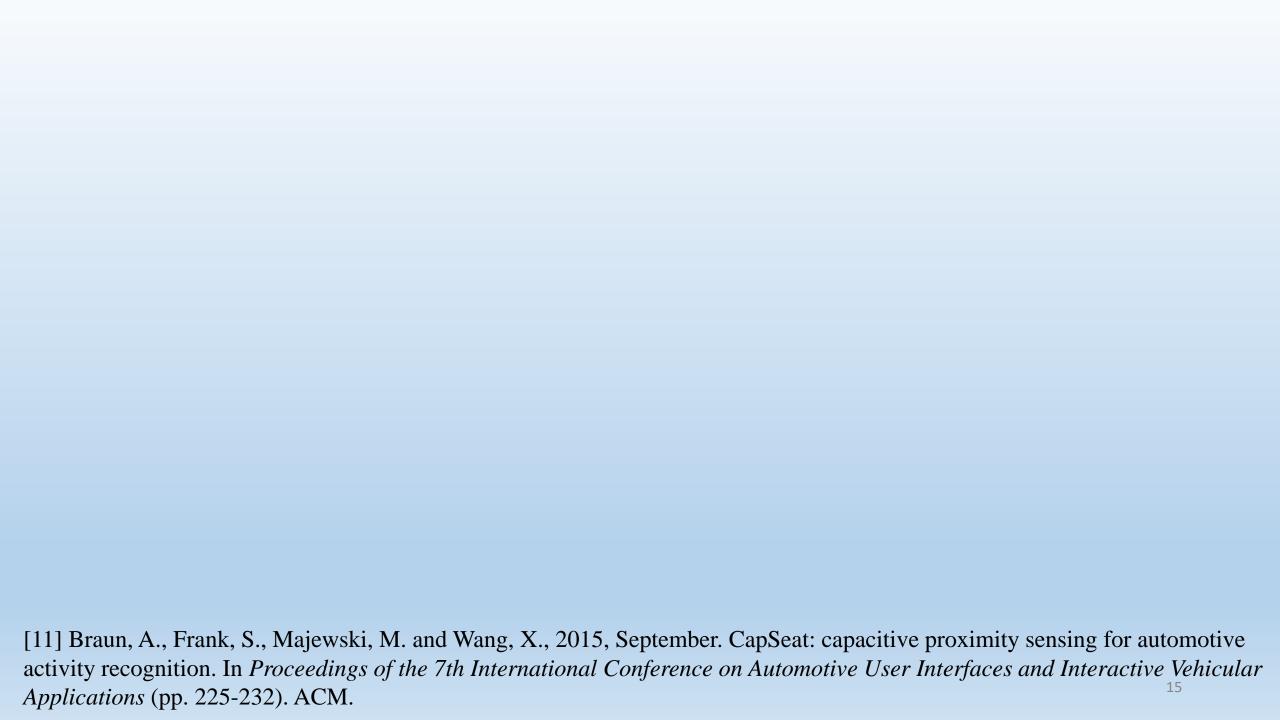


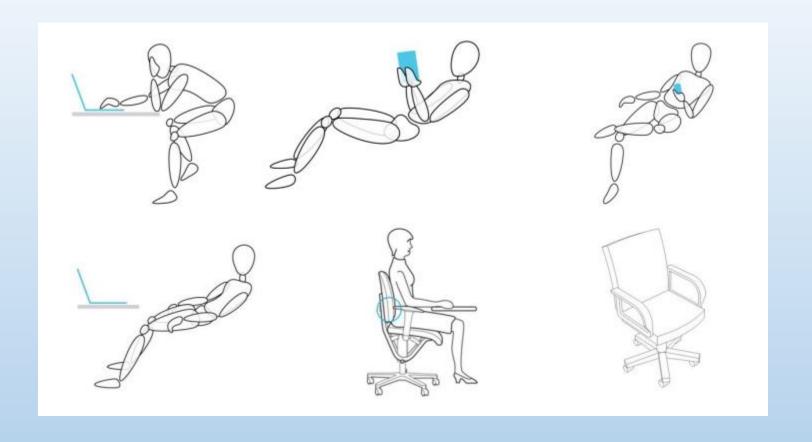
Table 2. Classification results						
# samples	Rate					
2522	100.00%					
2682	95.26%					
885	99.80%					
410	94.15%					
410	100.00%					
2596	97.50%					
103	100.00%					
372	95.20%					
1604	99.69%					
1732	100.00%					
	# samples 2522 2682 885 410 410 2596 103 372 1604					

^[11] Braun, A., Frank, S., Majewski, M. and Wang, X., 2015, September. CapSeat: capacitive proximity sensing for automotive activity recognition. In *Proceedings of the 7th International Conference on Automotive User Interfaces and Interactive Vehicular Applications* (pp. 225-232). ACM.

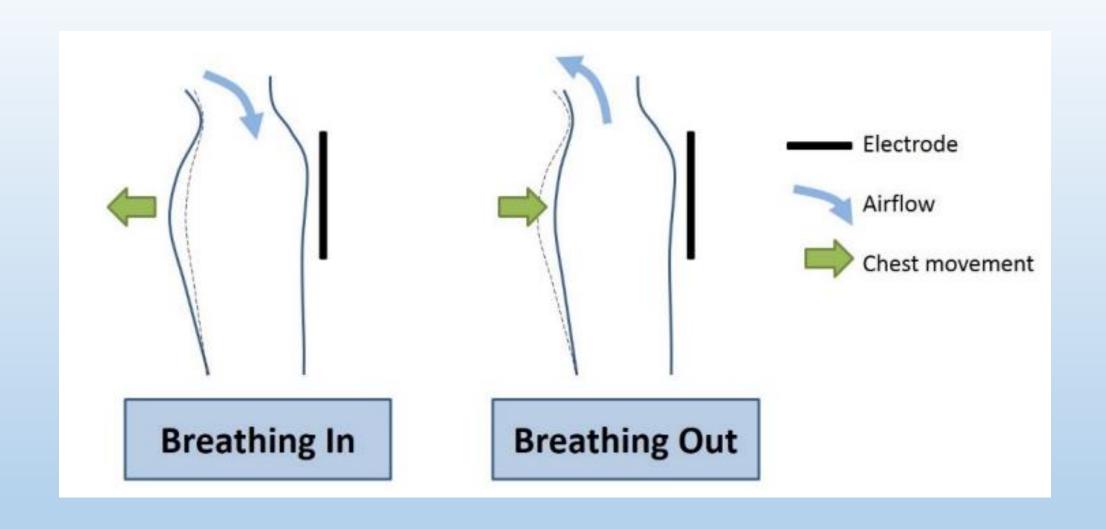


[12] Braun, A., Frank, S. and Wichert, R., 2015, August. The capacitive chair. In *International Conference on Distributed*, *Ambient, and Pervasive Interactions* (pp. 397-407). Springer, Cham.

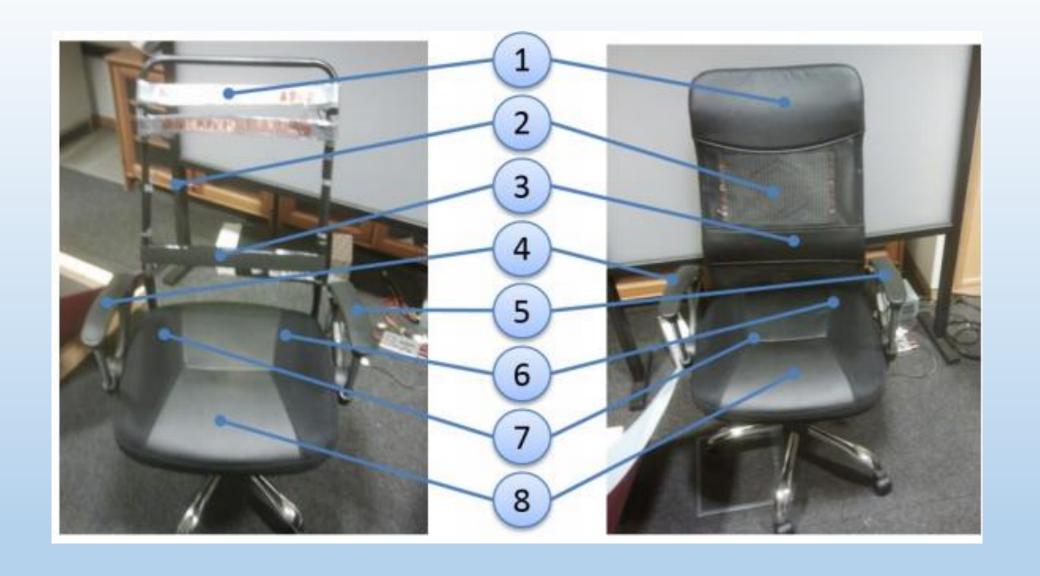




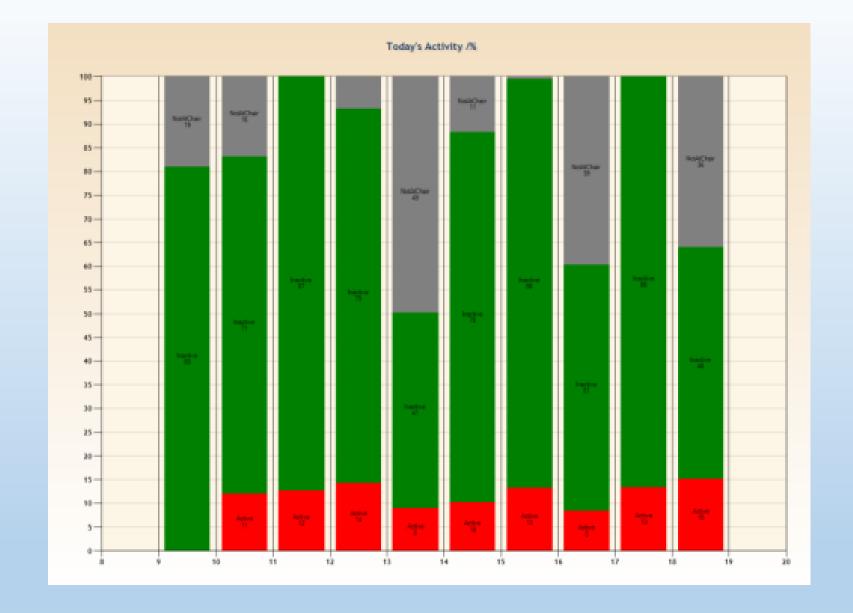
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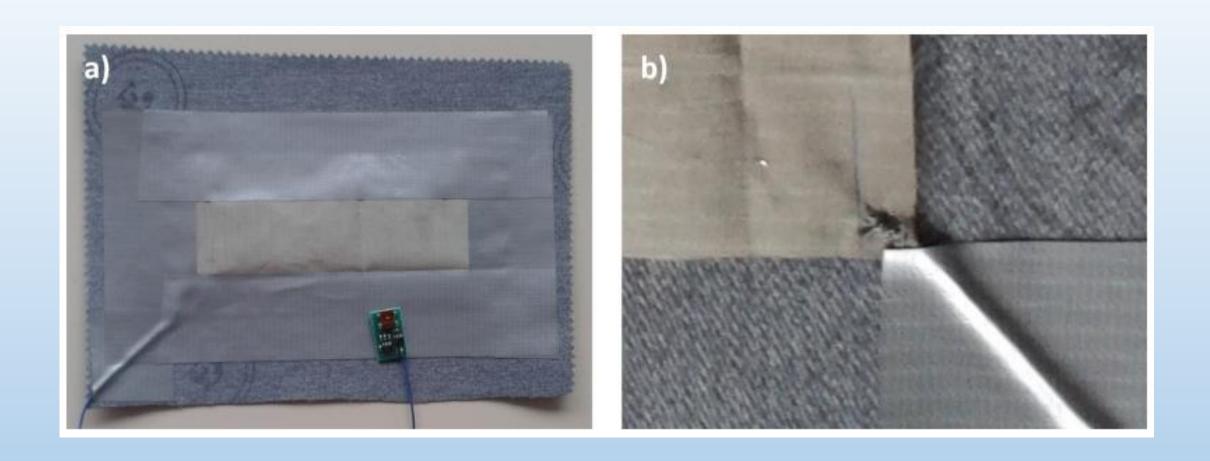
Table 1. Results of posture recognition test in percent

	S1	S2	S3	S4	S5	S6	S7	S8	S9	S10	Avg
Upright	100	100	100	100	100	100	100	100	100	100	100
The Strunch	100	100	100	100	86	100	100	100	100	100	98,6
Take it in	100	100	100	100	100	100	100	100	55	100	95,5
Close to chair	100	100	100	100	100	100	100	100	100	100	100

[12] Braun, A., Frank, S. and Wichert, R., 2015, August. The capacitive chair. In *International Conference on Distributed, Ambient, and Pervasive Interactions* (pp. 397-407). Springer, Cham.



[13] Rus, S., Braun, A. and Kuijper, A., 2017, April. E-Textile Couch: Towards Smart Garments Integrated Furniture. In *European Conference on Ambient Intelligence* (pp. 214-224). Springer, Cham.



[13] Rus, S., Braun, A. and Kuijper, A., 2017, April. E-Textile Couch: Towards Smart Garments Integrated Furniture. In *European Conference on Ambient Intelligence* (pp. 214-224). Springer, Cham.

- Class 1 Empty couch
- Class 2 Sitting upright, on right side
- Class 3 Sitting on edge, on right side
- Class 4 Sitting leaned back, on right side
- Class 5 Sitting upright, on right side, using armrest in front
- Class 6 Sitting leaned back, on right side, using armrest in front
- Class 7 Sitting leaned back, on right side, using armrest at back
- Class 8 Sitting upright, in the middle
- Class 9 Sitting on edge, in the middle
- Class 10 Sitting leaned back, in the middle
- Class 11 Sitting upright, on left side
- Class 12 Sitting on edge, on left side
- Class 13 Sitting leaned back, on left side
- Class 14 Lying down, head on right side
- Class 15 Lying down, head on left side

[13] Rus, S., Braun, A. and Kuijper, A., 2017, April. E-Textile Couch: Towards Smart Garments Integrated Furniture. In *European Conference on Ambient Intelligence* (pp. 214-224). Springer, Cham.



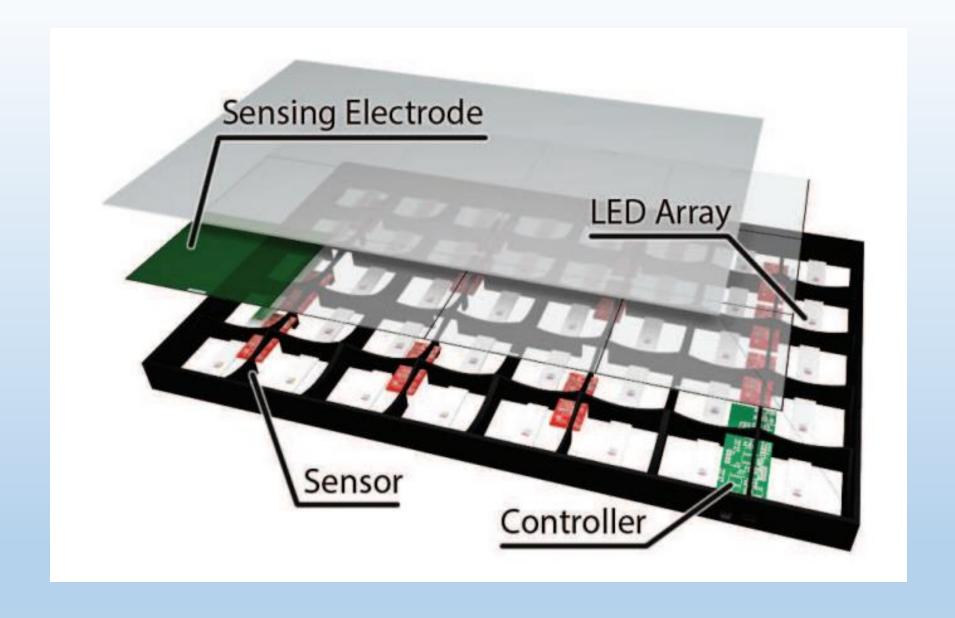
Fig. 3. a) Sitting upright; b) Sitting upright using armrest in front; c) Sitting leaned back using armrest in front; d) Sitting leaned back using armrest at back;

[13] Rus, S., Braun, A. and Kuijper, A., 2017, April. E-Textile Couch: Towards Smart Garments Integrated Furniture. In *European Conference on Ambient Intelligence* (pp. 214-224). Springer, Cham.

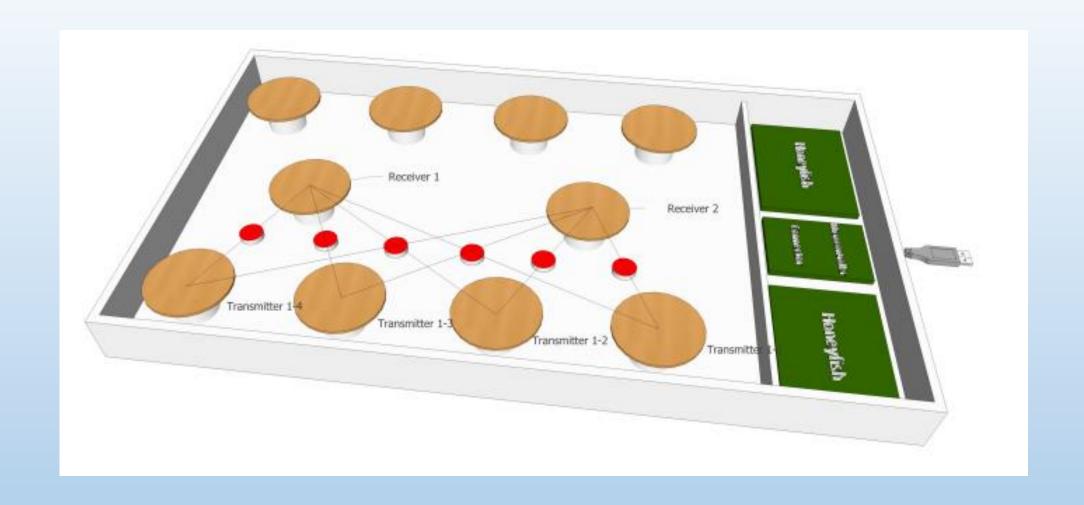
	C4.5 dec	ision tree	kNN		Naive Ba	ayes	SVM		
Data	Acc.[%]	F-m.[%]	Acc.[%]	F-m.[%]	Acc.[%]	F-m.[%]	Acc.[%]	F-m.[%]	
Raw	82.3	77.0	80.7	75.6	84.0	79.8	85.7	81.9	
Normalized	89.1	86.0	88.9	86.2	87.2	84.1	91.2	88.8	
Subset raw	83.3	78.9	87.5	83.9	89.7	87.0	90.45	88.1	
Subset normalized	89.9	87.2	91.6	88.9	95.3	94.1	95.5	94.1	

[13] Rus, S., Braun, A. and Kuijper, A., 2017, April. E-Textile Couch: Towards Smart Garments Integrated Furniture. In *European Conference on Ambient Intelligence* (pp. 214-224). Springer, Cham.

Smart Surface

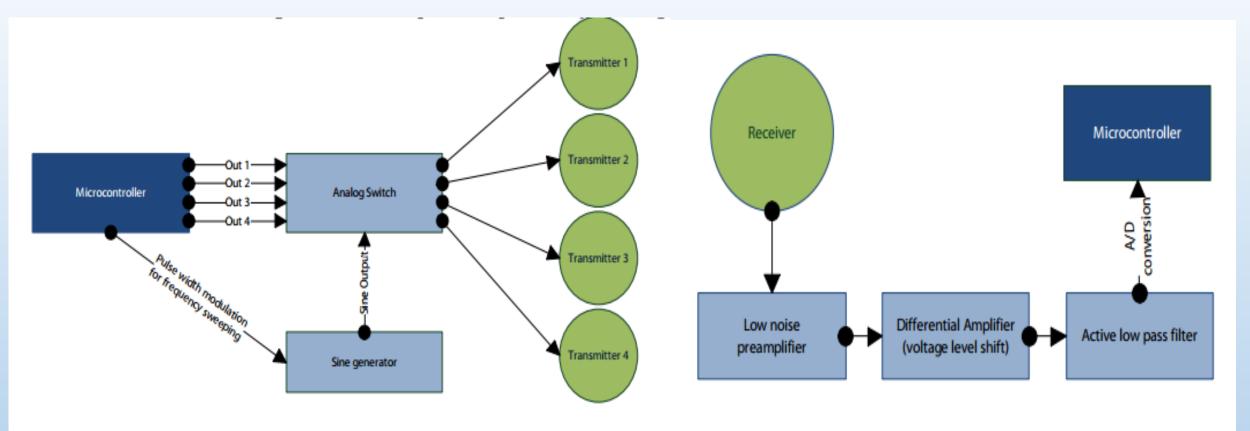


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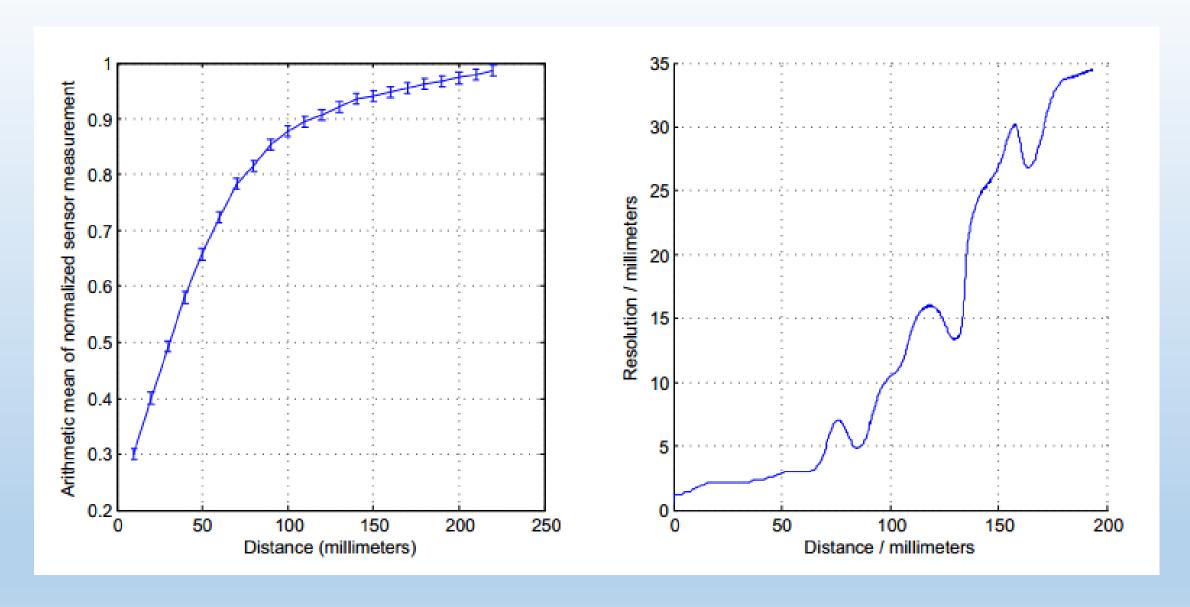
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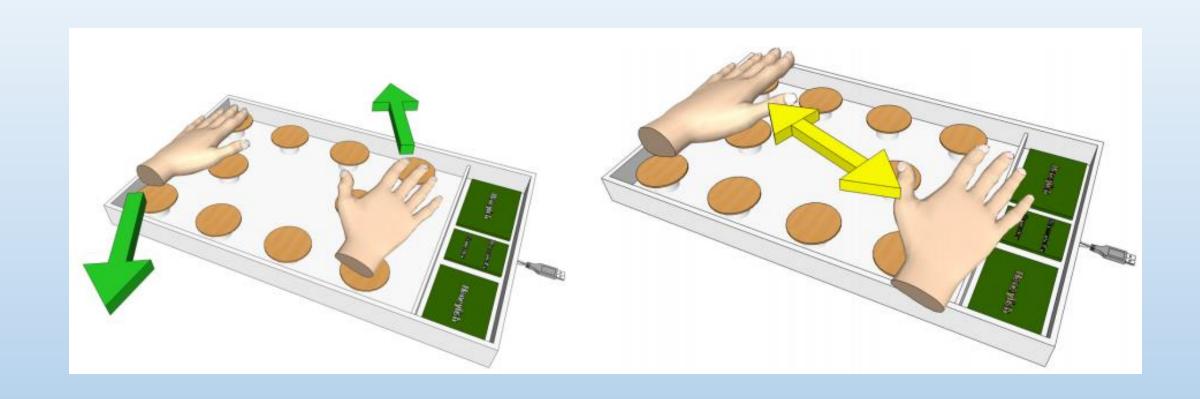
 ${\bf Fig.\,6.}$ Block diagram of the transmitter

Fig. 7. Block diagram of the receiver circuit

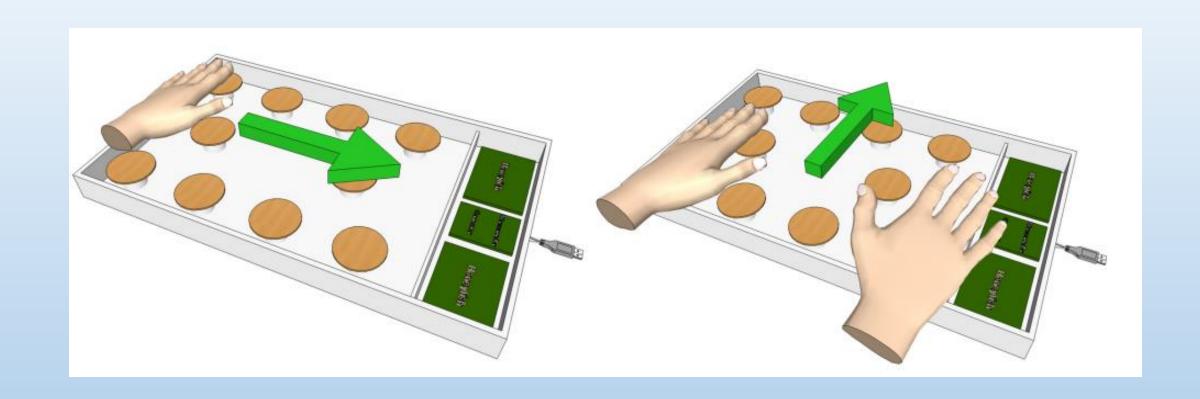
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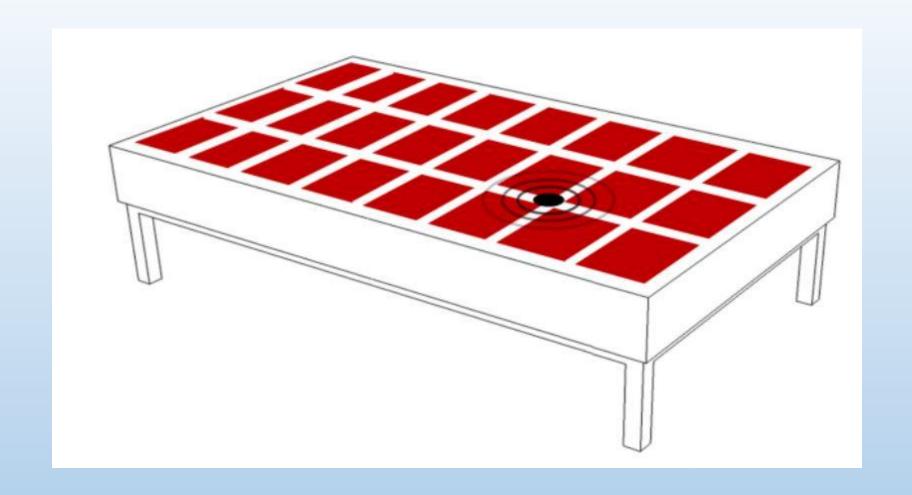
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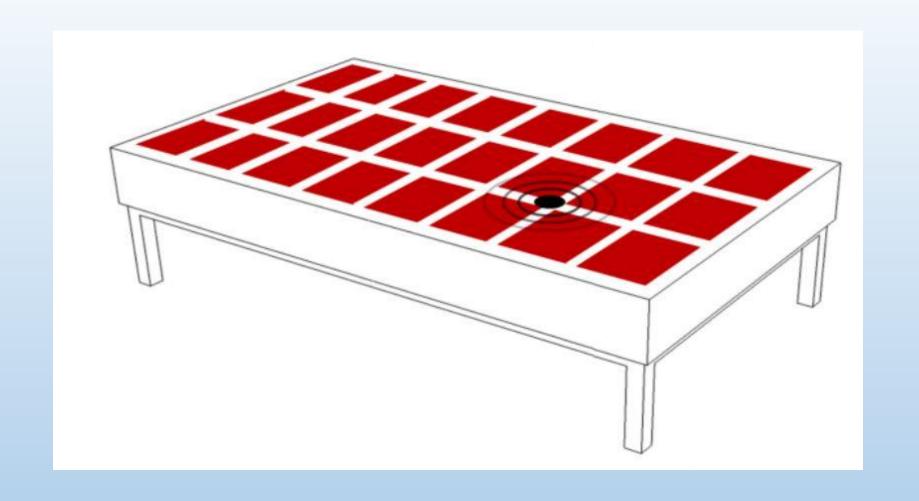


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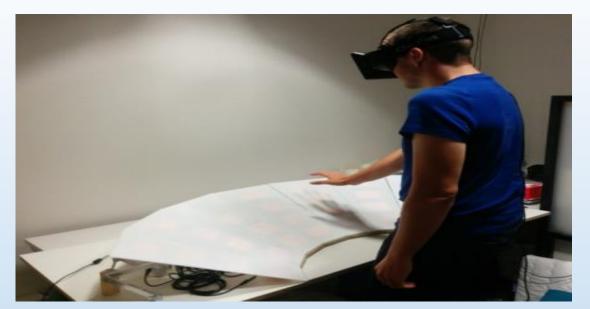


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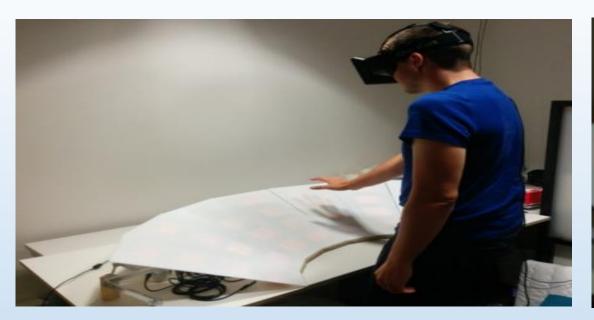
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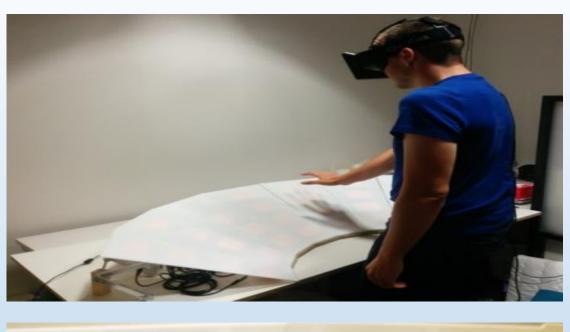






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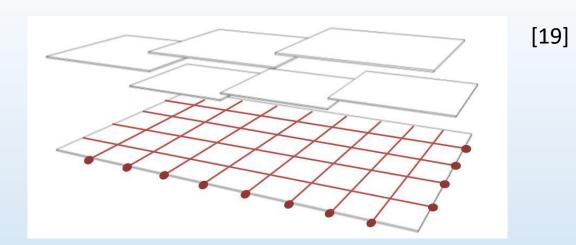


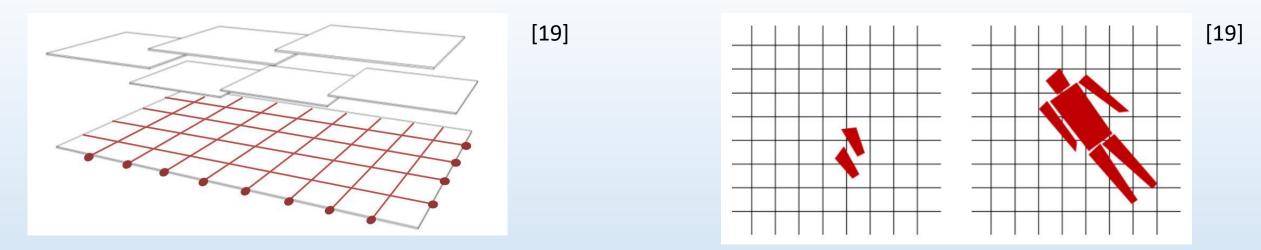




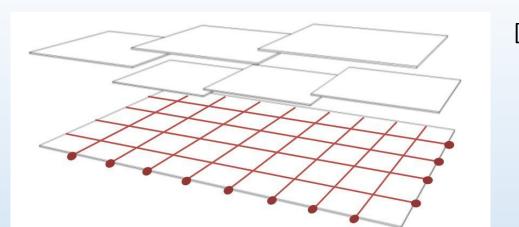
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Smart Floor

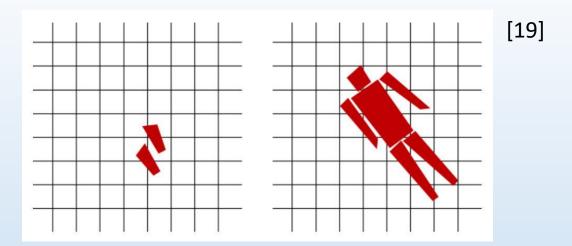




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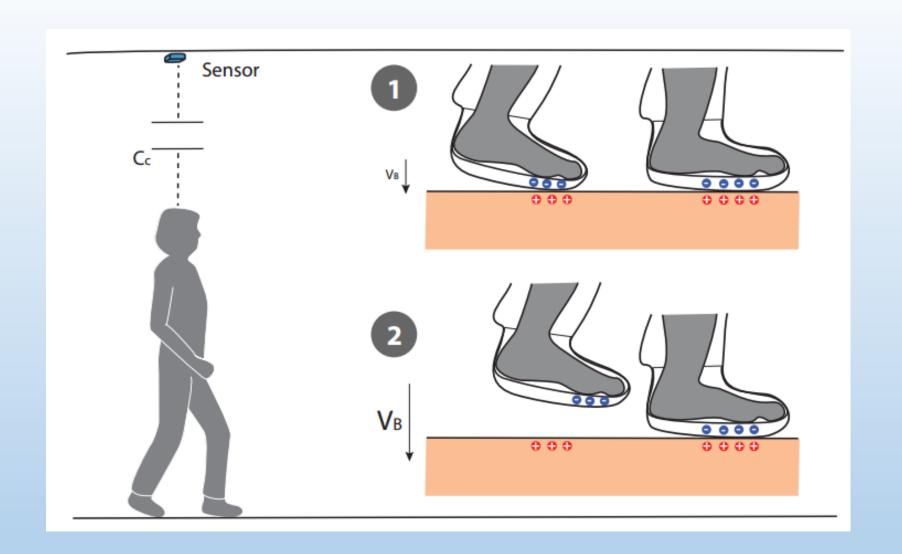


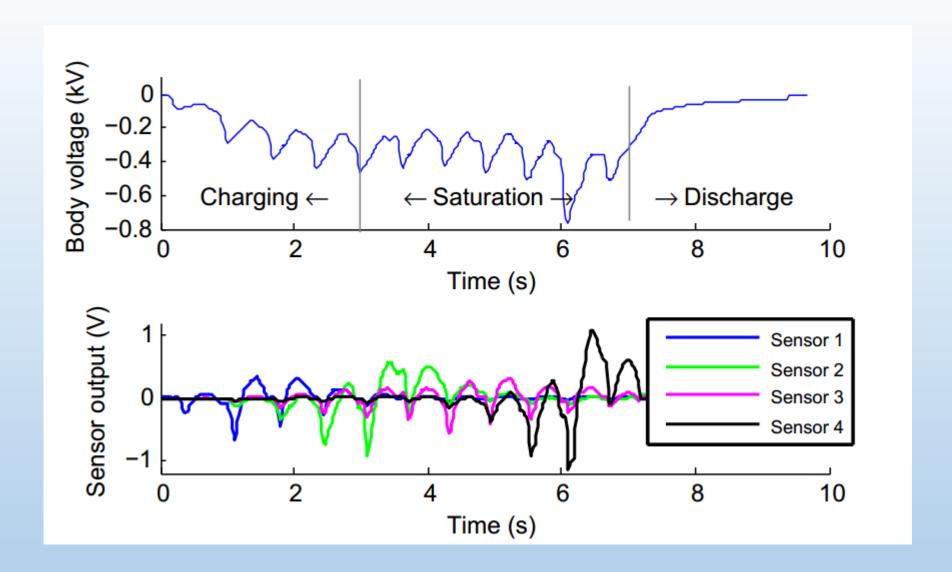


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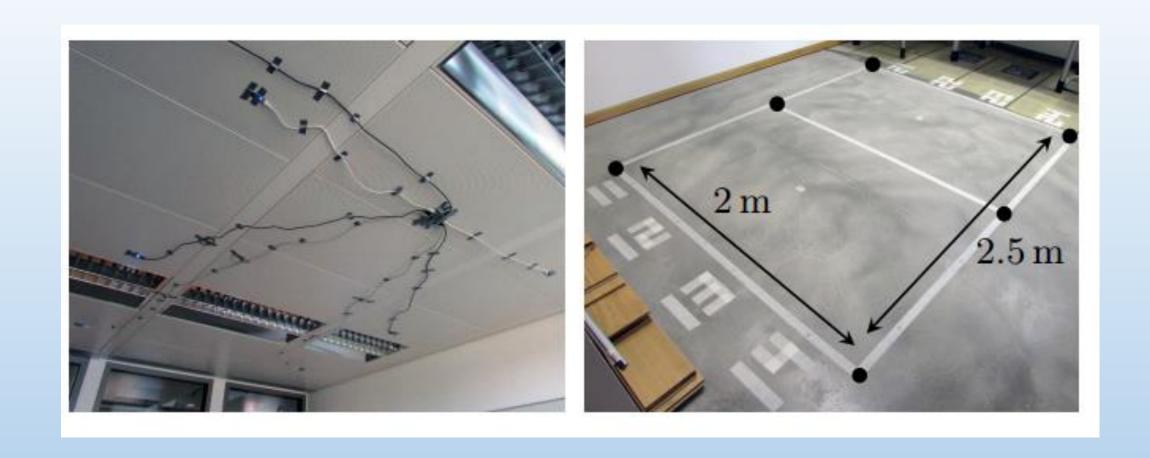
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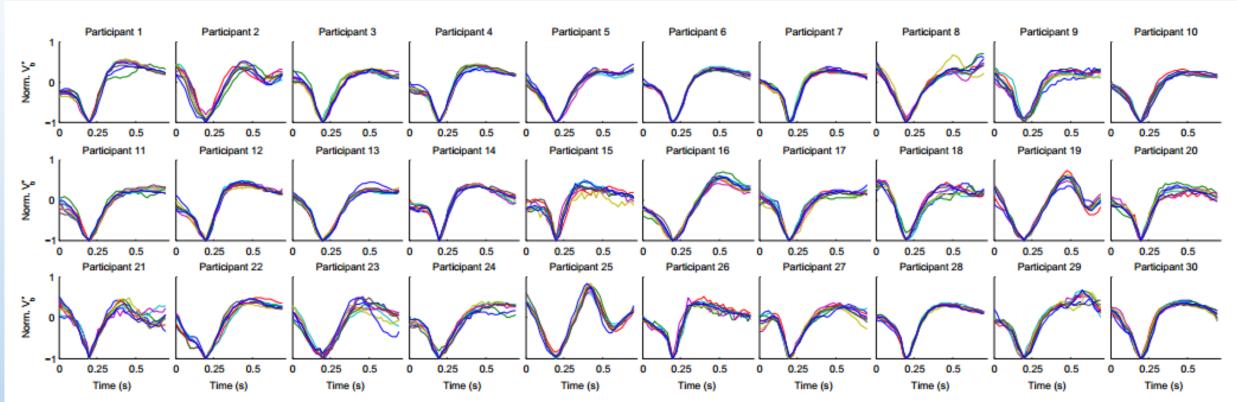
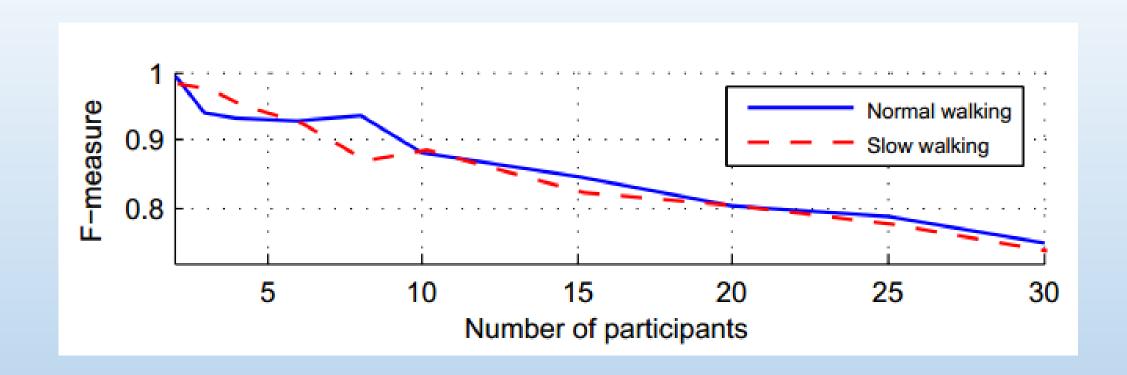


Figure 13: The estimated body electric potential changes when taking a step (step signatures) differ from user to user and represent a discriminative measure for classification. The amplitudes depend on the actually carried charge and require normalization.



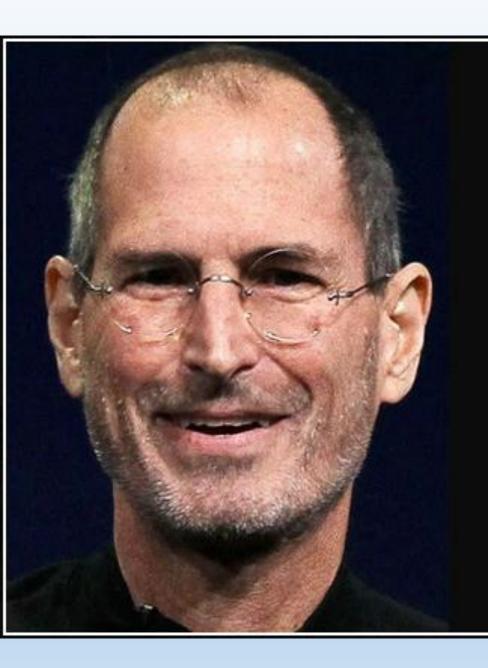
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I hate the way people use slide presentations instead of thinking. People would confront a problem by creating a presentation. I wanted them to engage, to hash things out at the table, rather than show a bunch of slides. People who know what they're talking about don't need PowerPoint.

— Steve Jobs —

AZ QUOTES