

# Low noise, low power capacitive sensors for tagless indoor human localization and identification



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- ▶ Why long-range capacitive sensing?
- ▶ Capacitance measurement issues
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# Why long-range indoor capacitive sensing?

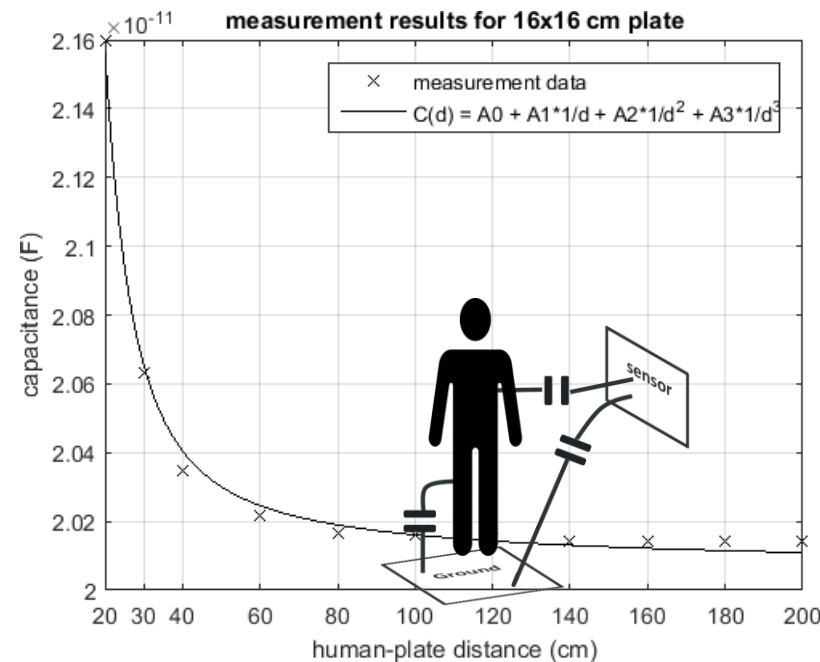
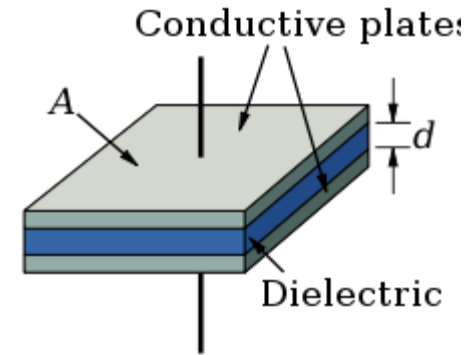


- ▶ Enabler for many automation and monitoring applications
- ▶ Can be small, inexpensive, easy to install and operate
- ▶ Generally have low accuracy and low range
- ▶ Need very low noise measurement ( $C \sim A / d^{2\div 3}$ )
- ▶ Sensor data post-processing
  - ▶ Improve SNR ( $\Delta C < 0.01\%$ )
  - ▶ Infer human identity, location and behavior

# Measurement challenges



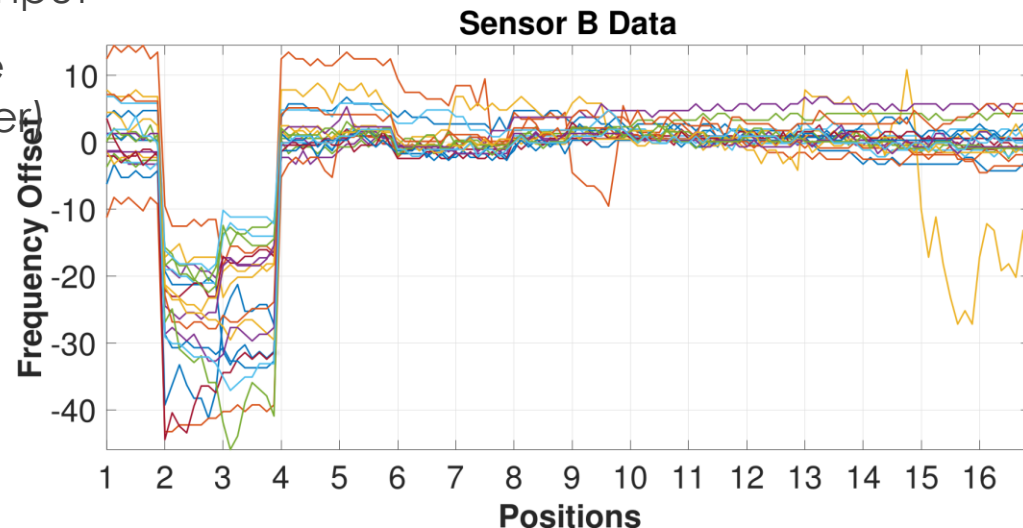
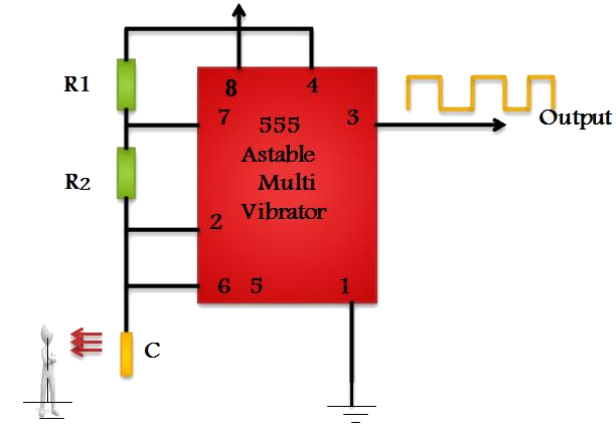
- Planar capacitors:  $\sqrt{A} \gg d$ 
  - $C = \varepsilon A / d$
- Load-mode sensors:  $d \gg \sqrt{A}$ 
  - $C \sim A / d^{2.3}$
- $d$  (meters)  $\gg \sqrt{A}$  (tens of cm):
  - Very low  $\Delta C$  ( $< 0.01\%$ )
  - Very high sensitivity
  - Very high noise rejection



# Single-plate threshold-based measurement front-end



- ▶  $C = Q / V$ 
  - ▶ Control Q flow, set V thresholds
  - ▶ Measure  $f \sim 1 / \text{time-to-V threshold}$
- ▶ Simple, cheap, low-power
- ▶ Low C, low I for kHz-range f (lower quantization noise)
  - ▶ Very high impedance input
  - ▶ Susceptible to EM noise (Vnoise => f value & jitter)
  - ▶ Susceptible to drift (low frequency noise)
  - ▶ Difficult noise filtering
- ▶ Low SNR overall



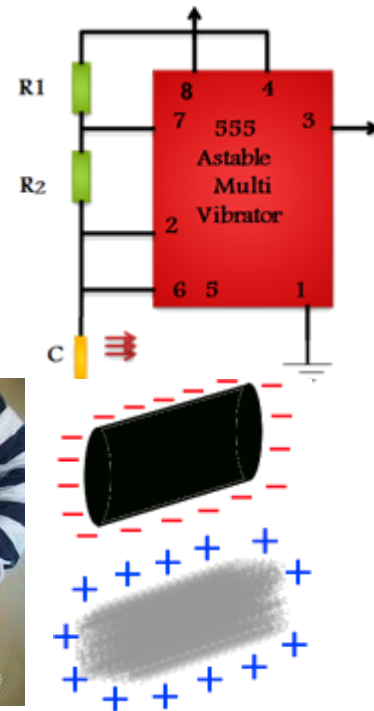
# Main sources of noise



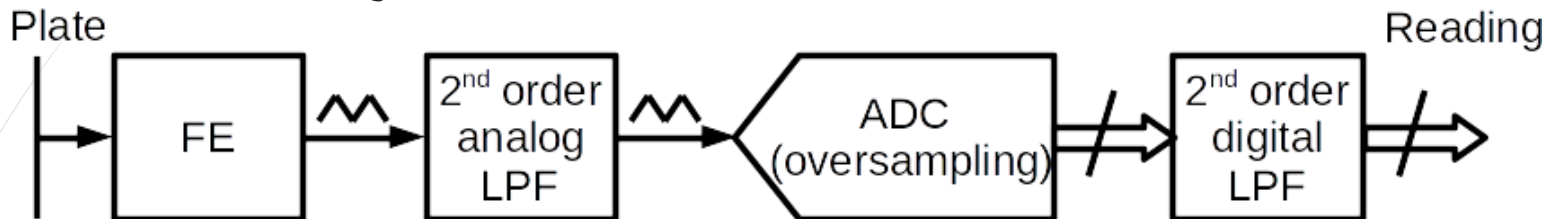
- Drift due to static charges (low frequency)
  - Change plate potential to environment
  - Variable with body movement, charge migration
  - Asymmetric influence on plate charge/discharge currents
  
- Environmental noise (high freq.)
  - Jitter and reduced osc. Period (plate reaches unpredictably and earlier voltage thresholds)
  
- **Fix: 1.** voltage thresholds **2.** compensate current asymmetry



From explainthatstuff.com

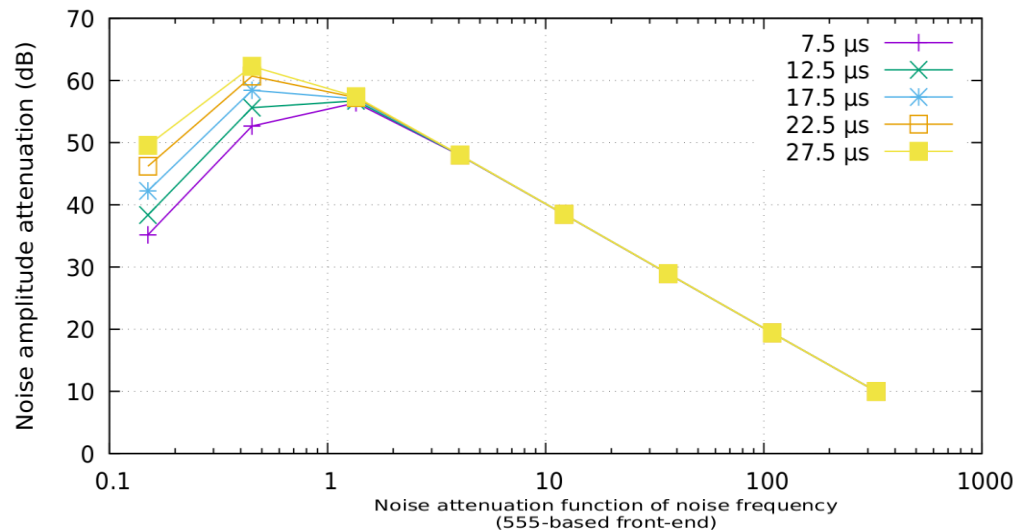


# Drift rejection



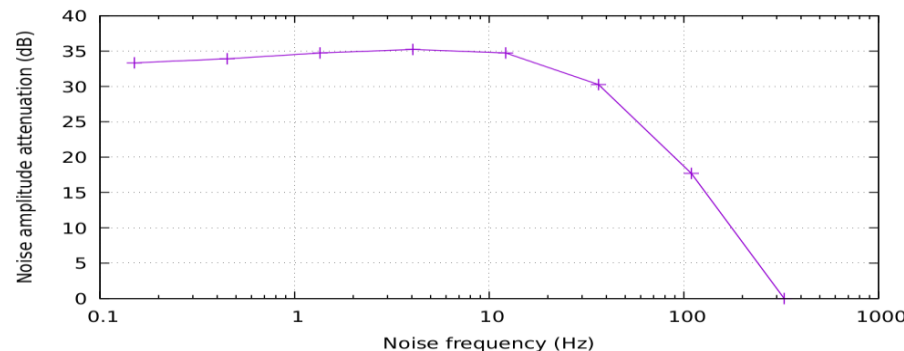
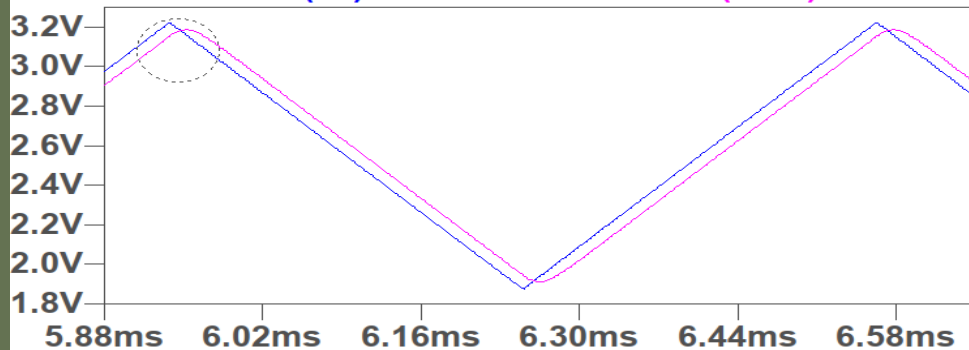
- Ignore non-linearities at ramp ends
- High attenuation for low frequencies (drift)
- Simulation noise at high attenuation

Noise attenuation function of noise frequency and measurement separation from ramp ends (with second order 20 kHz cutoff antialias filter)



$V(vc)$

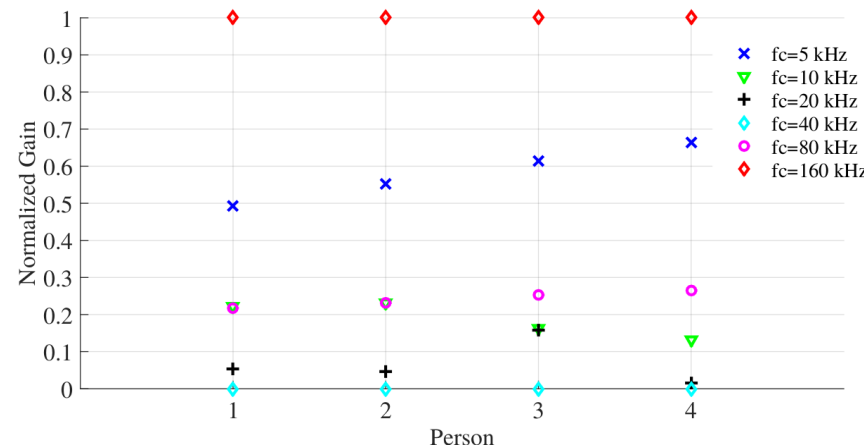
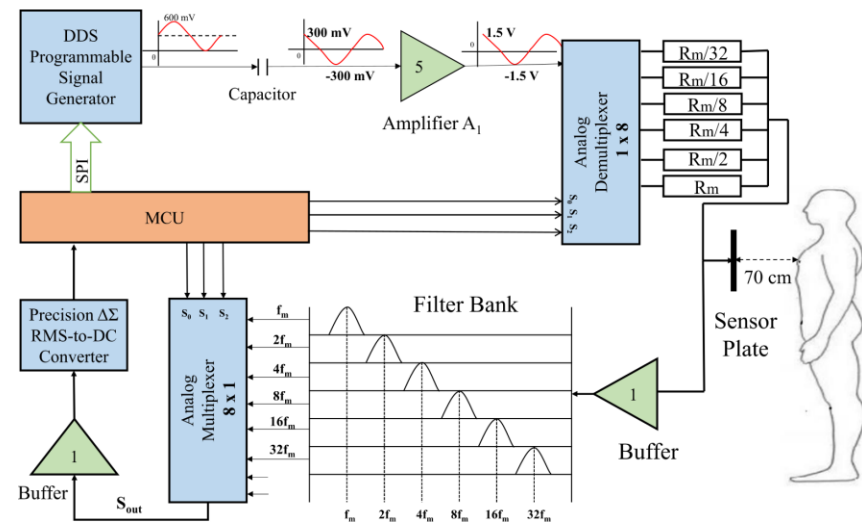
$V(vout)$



# Human identification

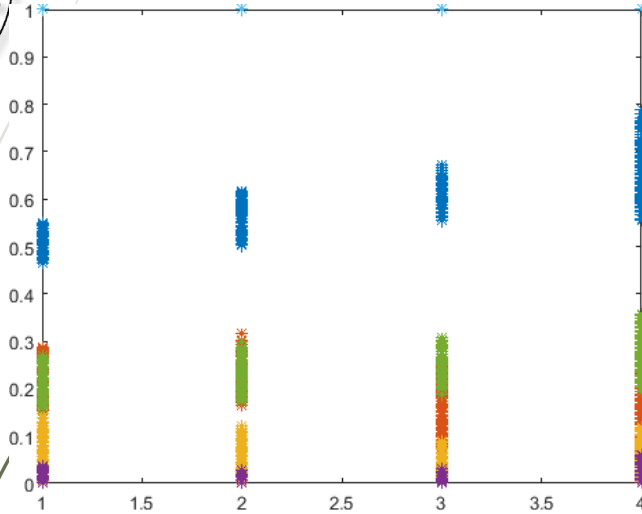


- Measure the body-sensor capacitance at several frequencies at (almost) the same time
- Capacitance-frequency dependency pattern depends on body properties (tissue ratios, shape, ...)
- Distinct patterns can identify persons from a limited pool
- Monitor passage through doors





# Embedded low power Neural Network inference



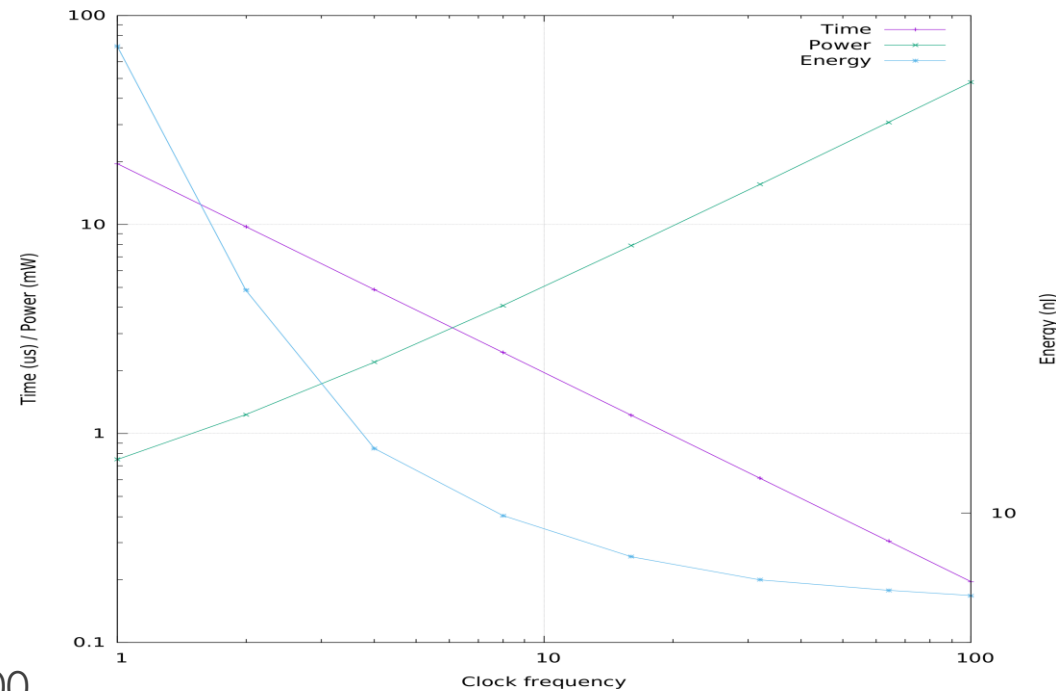
		Hidden Layer			
		1	2	3	4
Number of nodes in each layer	4	5,23 %	5 %	4,8 %	4,88 %
	8	4,93 %	4,9 %	4,9 %	4,91 %
	16	4,98 %	4,89 %	4,93 %	4,89 %
	32	4,94 %	4,85 %	4,86 %	4,85 %

- Noise-augmented data to 40,000 tuples: 28,000 training, 12,000 test
- Little degradation for small NNs on data augmented with noise
- 2 hidden layers with 8 neurons each for implementation exploration

# Embedded low power Neural Network inference



- ▶ Lattice ICE40UP5K
  - ▶ 5280 LUT (32%)
  - ▶ 8 DSP (100%)
  - ▶ **277  $\mu$ W static**
- ▶ Candidates (no DSP)
  - ▶ Microsemi AGLN250
    - ▶ 3000 LE
    - ▶ **24  $\mu$ W static**
  - ▶ Microsemi M1AGL1000
    - ▶ 11000 LE
    - ▶ **53  $\mu$ W static**



# Conclusions



- ▶ Indoor low-cost low-power capacitive sensing may enable many smart applications
- ▶ Needs effective broadband noise reduction
- ▶ Low-power analog and digital processors ( $\mu$ P, FPGA, ...)
- ▶ Low-power communication (used sparingly)
- ▶ Low-resource measurement and processing techniques



# Thank you.



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