

# CANDO 2020

## Investigation of Rogowski Current Sensors for Appliances Classification in NILM

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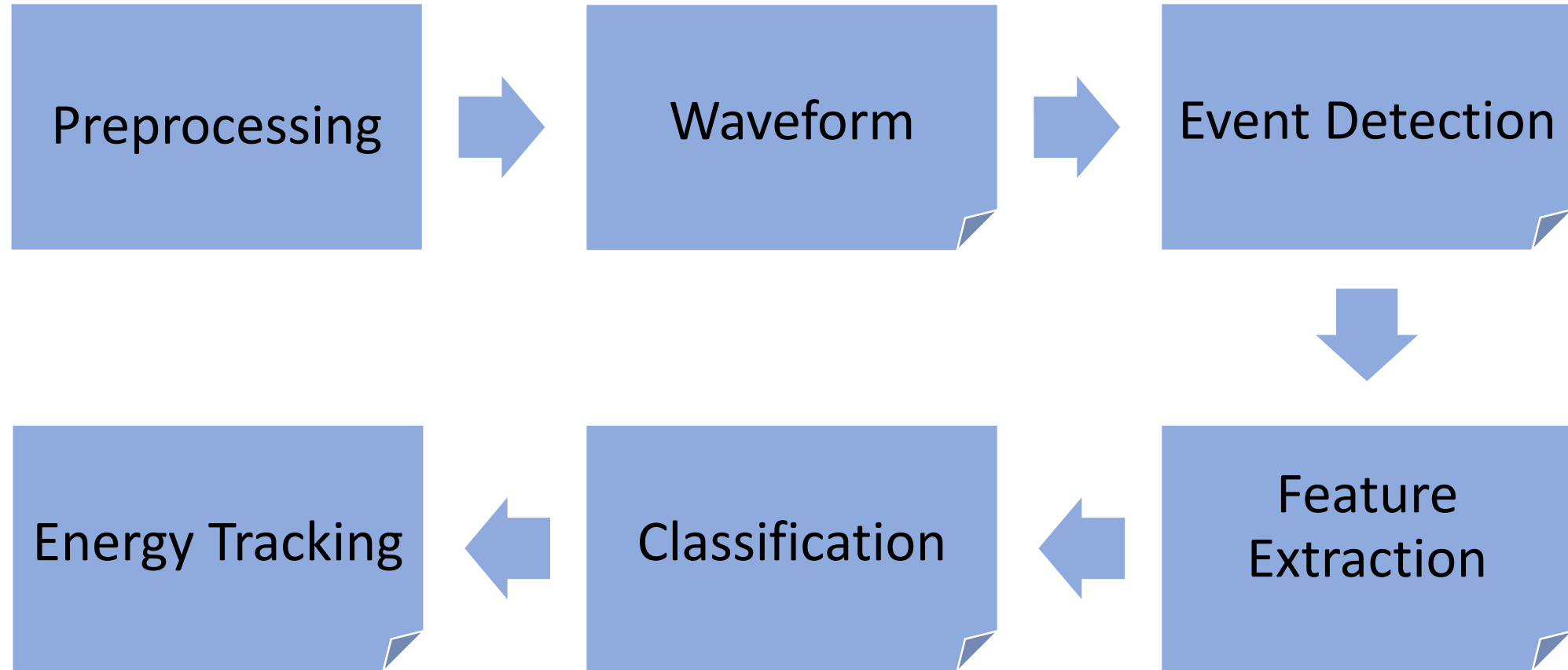
# Agenda

1. Introduction to NILM
2. Measurement System
3. Feature Extraction and Classification
4. Results
5. Conclusion

# The idea of NILM



# Structure of NILM



# Measurement System

- Comparison of current sensors
  - AC Current Transformer: TT 50-SD
    - Primary nominal current rms: 50 A
    - Split core type
    - Diameter for wire: 8mm
    - Bandwidth ( $\pm 1$ dB) 50/60 Hz
  - Rogowski coil: Metrawatt Metraflex 3003
    - Primary nominal current rms: 30/**300**/3000 A
    - flexible current sensors
    - Diameter for wire:  $\approx 200$  mm
    - Bandwidth 10 Hz ... 20 kHz

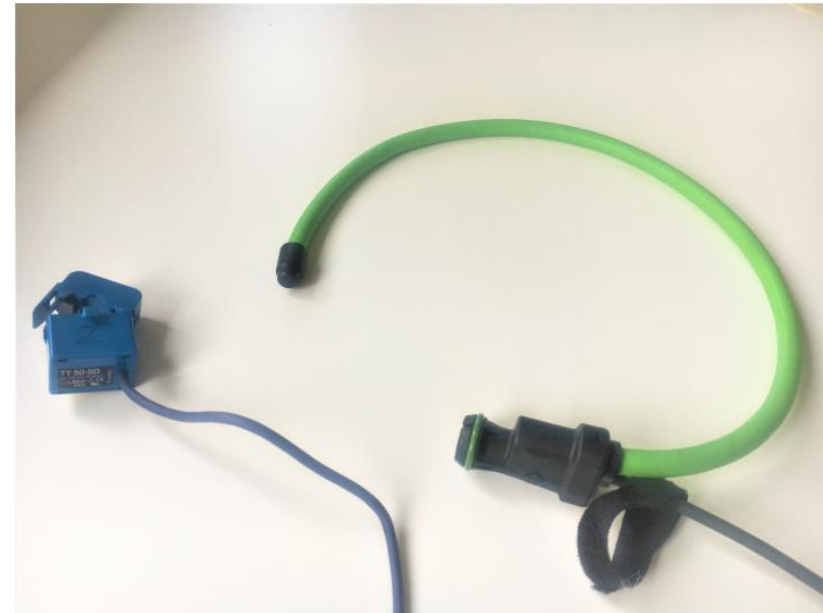
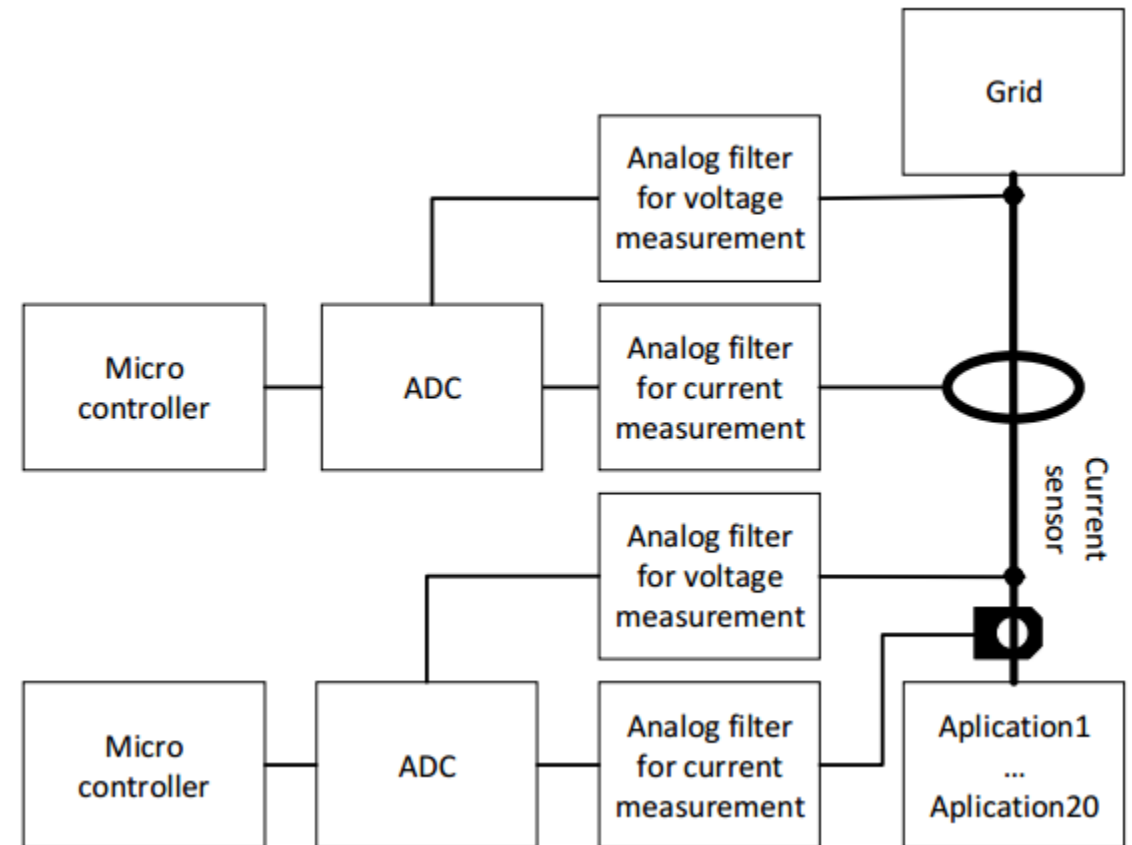


Illustration of the current-sensors to be evaluated. The conventional current transformers: LEM TT50SD (left) and the Rogowski coil Metraflex 3003 (right)

# Measurement System

- Two measuring systems were set up in parallel
- Current and voltage were measured
- The current was measured with the Rogowski coil and with the conventional current transformer



Measurement setup of NILM systems with a Rogowski coil and conventional current transformers.

# Measurement

- 20 devices have explicitly been switched on and off
- Current and voltage curves were recorded
- Each device was turned on and off 50 times
- Sampling frequency of 14 kHz
- Resolution of 16 bit (at a maximum current of 64 A)

$$I_{res} = I_{max} / 2^{15} = 2.76 \text{ mA}$$

$$I_{max} = 64 \text{ A} \cdot \sqrt{2} = 90.5 \text{ A}$$

TABLE I  
DEVICE LIST

Dev. No.	Name	P(W)
1	Hairdryer (setting 2)	1155
2	Radio	6.2
3	Hair Straightener	56
4	Heat Gun (setting 1)	820
5	Router	9.2
6	Desk Lamp	20
7	Kettle	2100
8	Hairdryer (setting 1)	500
9	Heat Gun (setting 2)	1603
10	Fan	22
11	Multifunction Tool (Dremel <sup>®</sup> )	30
12	LED lamp	1
13	Vaccum cleaner (Kobolt)	210
14	W-Lan Range extender TP-link TL-W850RE	1.4
15	Fan	22
16	Fan	22
17	Gray Desk Lamp	23
18	Laptop	60
19	Flex Bosch GWS 18 230	1800
20	Flex Hitachi	840

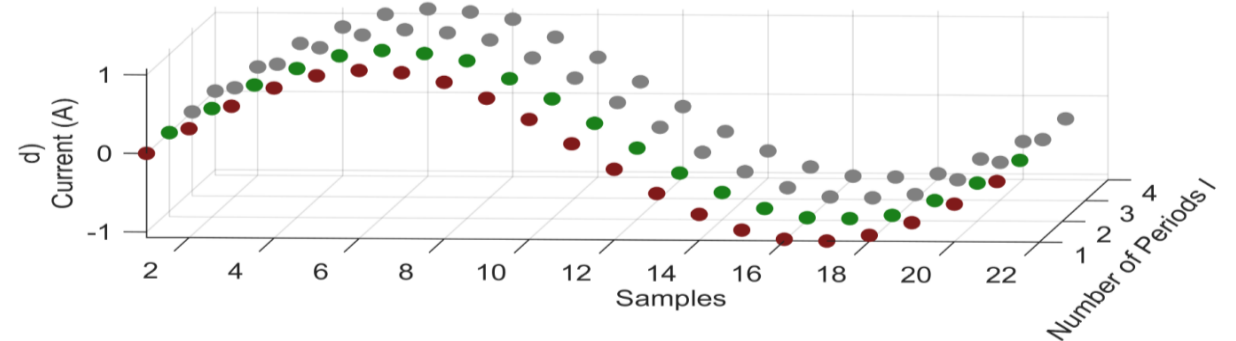
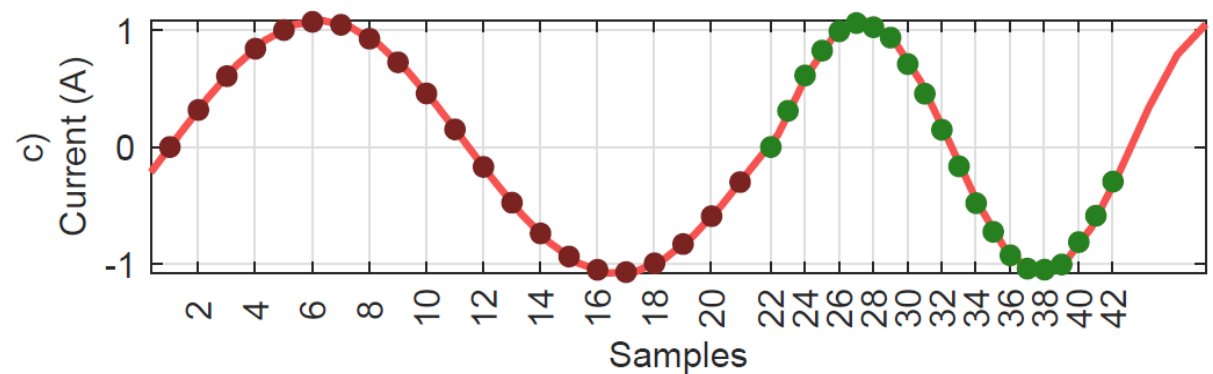
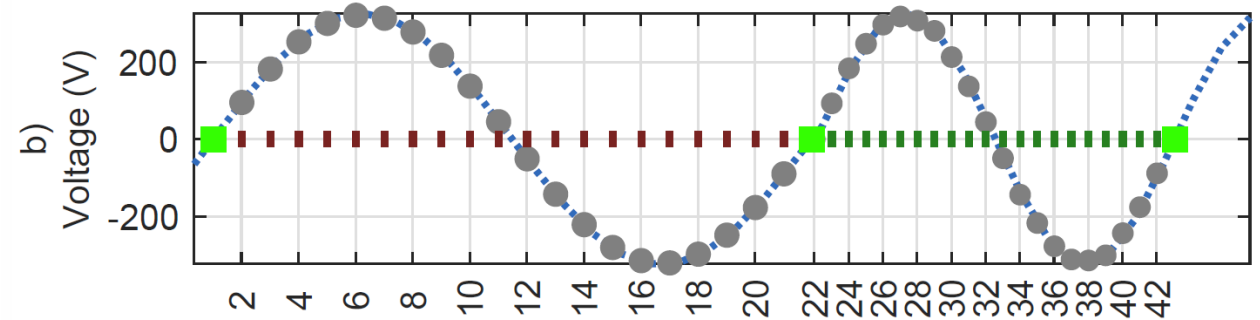
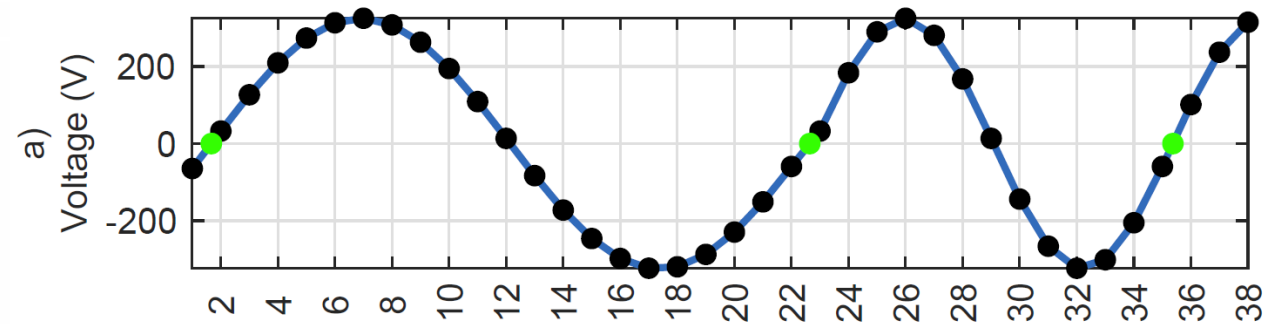
# Feature Extraction

## FIT-PS Procedure

- using the zero crossings voltage to detect one period
- define new equidistant sampling positions
- interpolation of the current signal
- reshape the signal

$$\mathbb{N}, \mathbb{N} \rightarrow \mathbb{R}$$

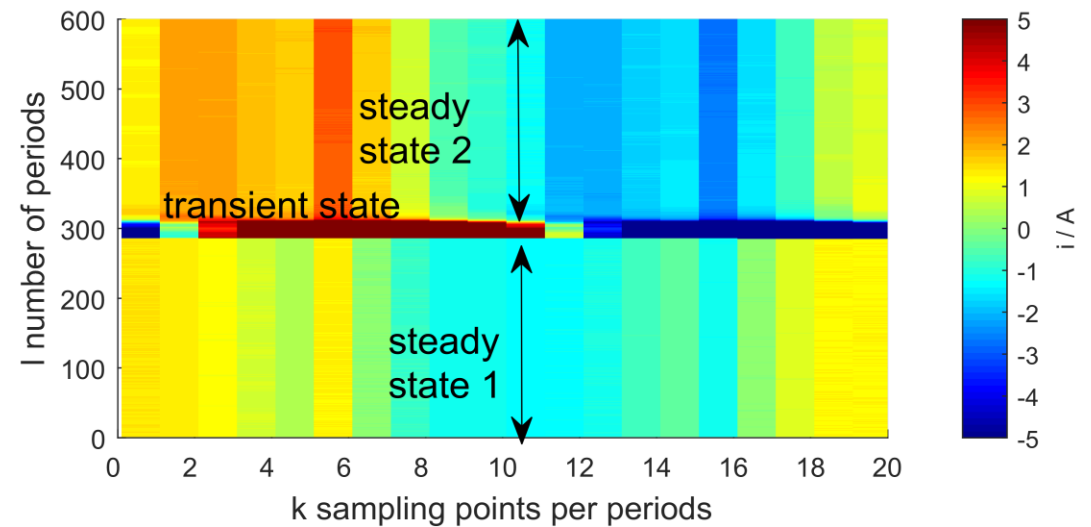
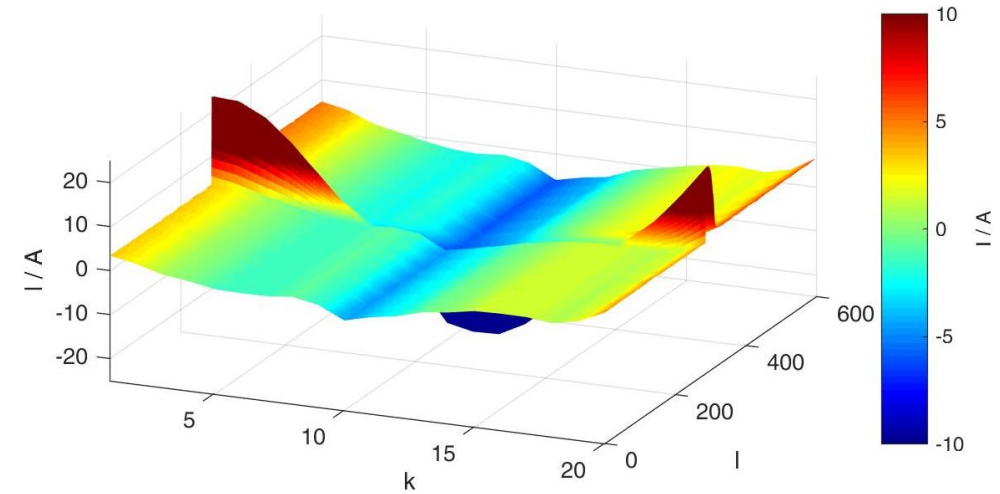
$$l, k \mapsto i \left( \underbrace{(l-1) \cdot T_g}_{\text{period}} + \underbrace{T_s \cdot k}_{\text{inside one period}} \right)$$



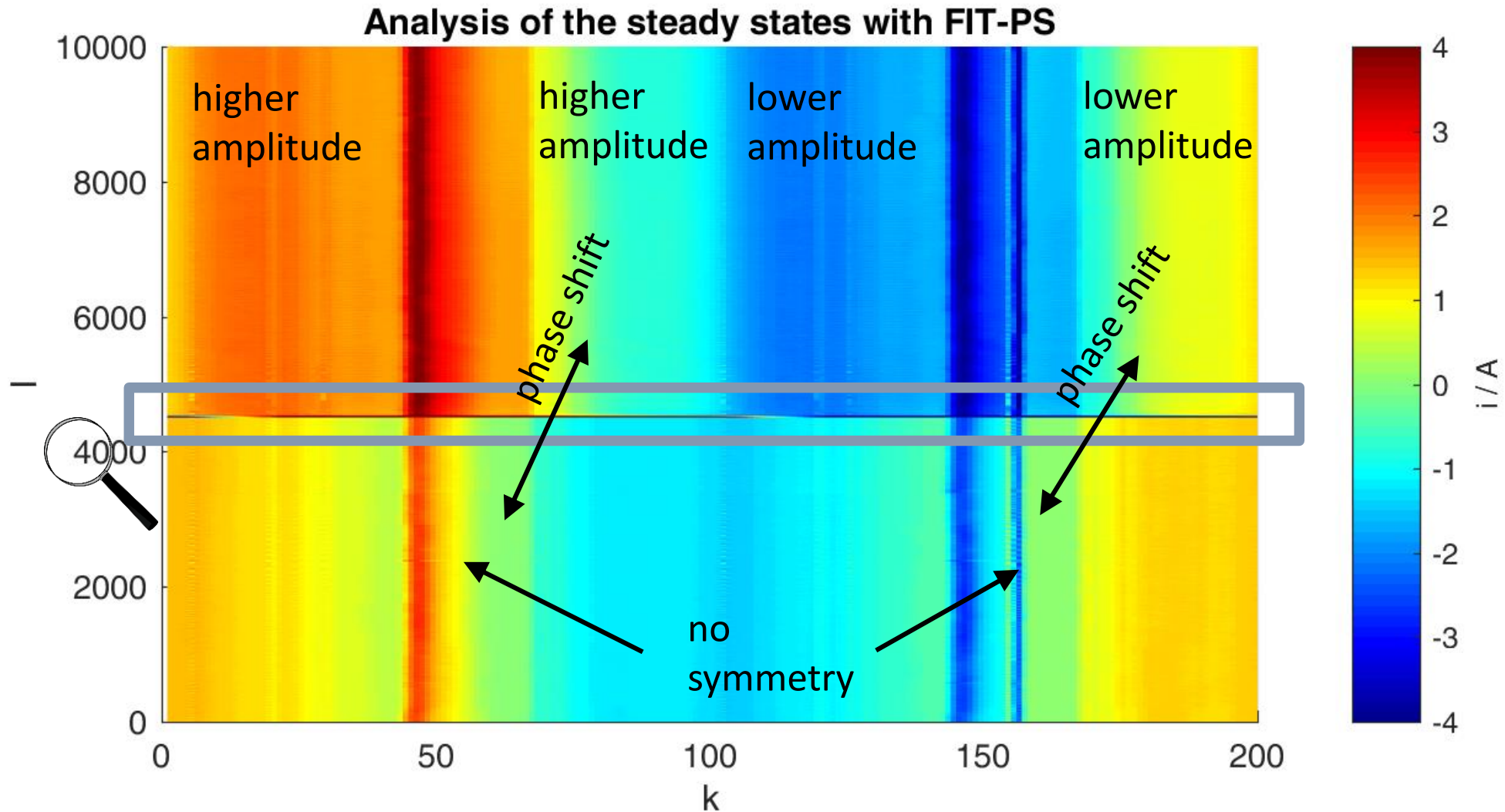


# Signal Analysis using FIT-PS

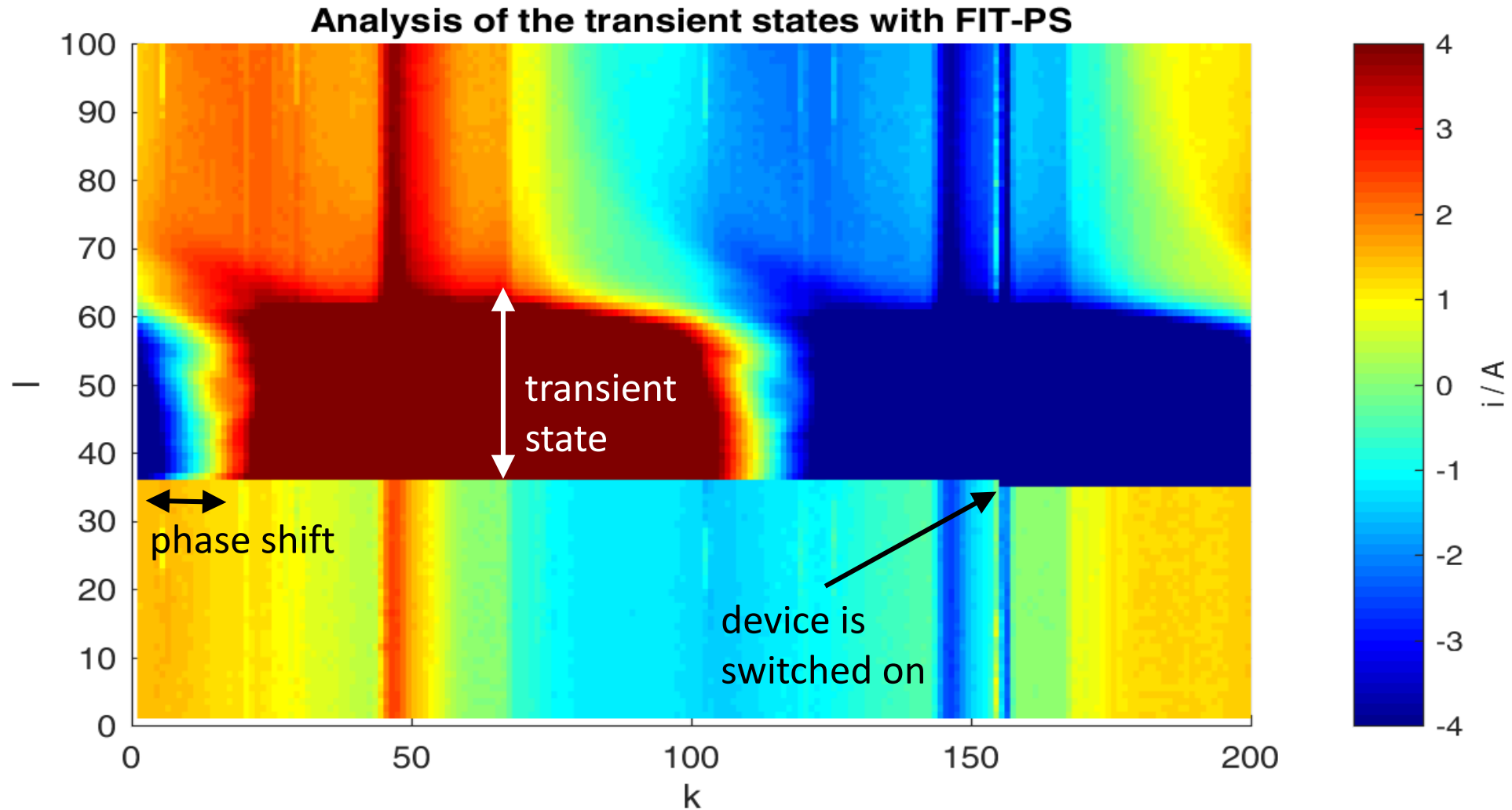
- Two steady states with a transient state between
- Only small variations along  $I$  direction in the dimensions  $k$  during the steady state
- Clear separation between the steady state and the transient state
- FIT-PS shows the difference of both steady states within one period



# High Sampled Signals

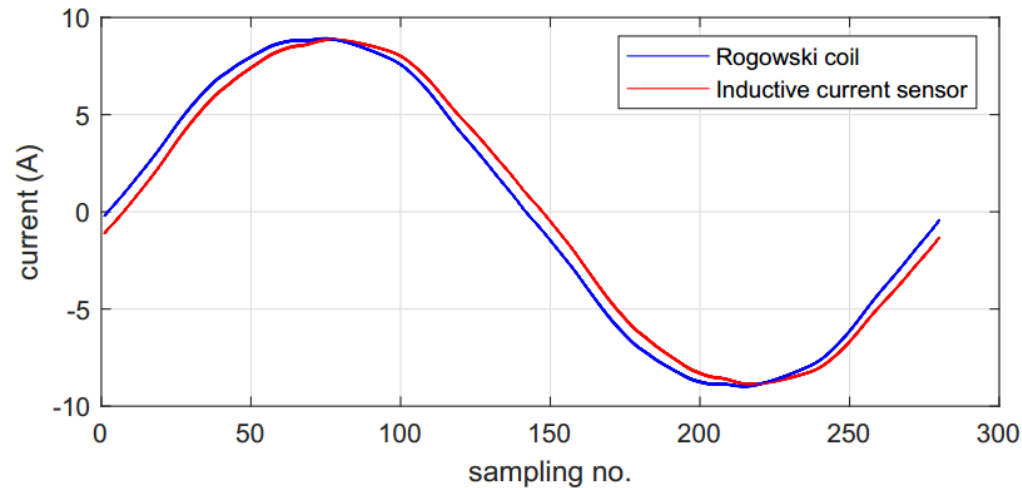


# High Sampled Signals

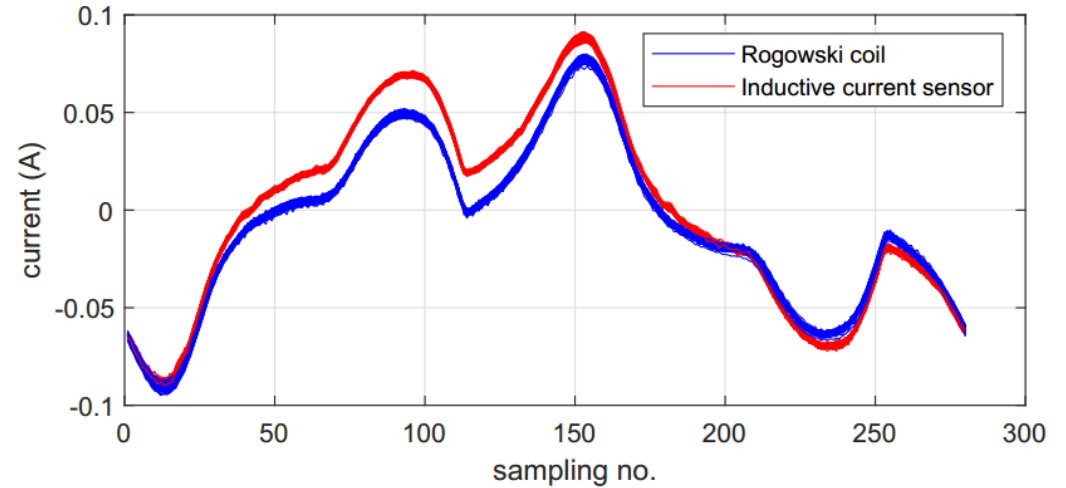


# Example of FIT-PS signal

- Example of FIT-PS signal representation of device No. 7



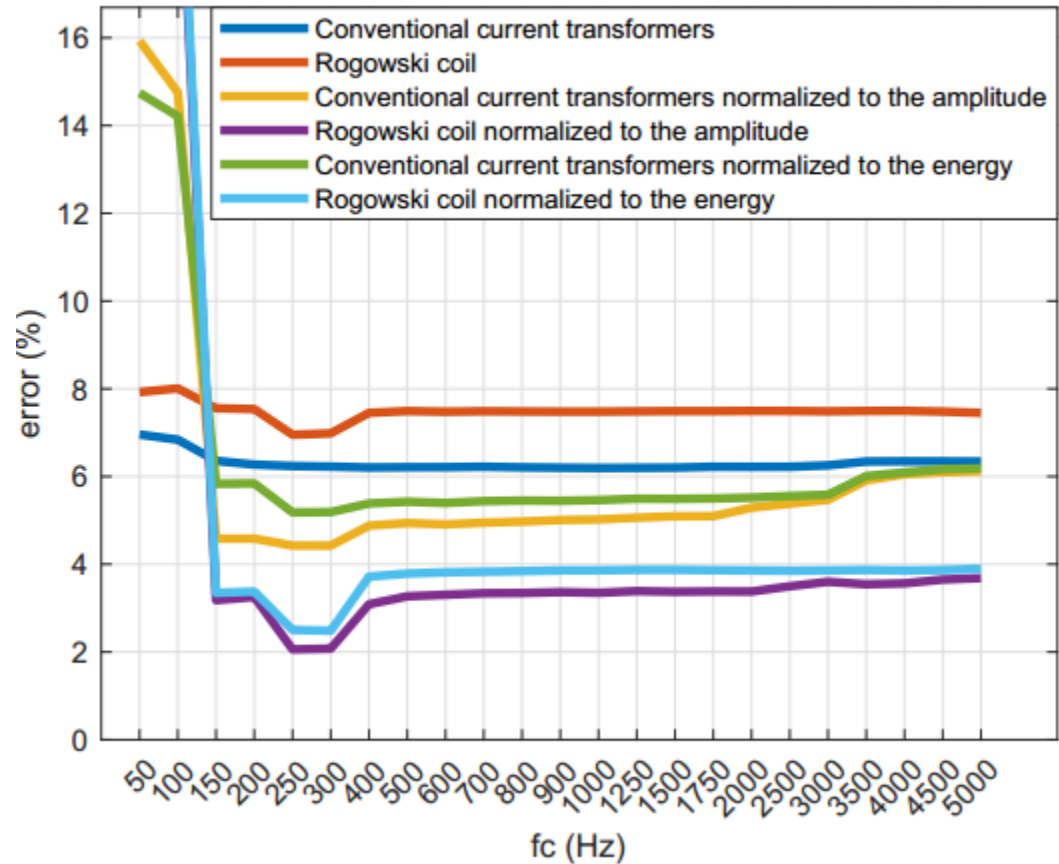
- Example of FIT-PS signal representation of device No. 5



- The figures show the FIT-PS feature with a characteristic current shape of a kettle and a router.
- Measured simultaneously with a Rogowski coil and a conventional current transformer

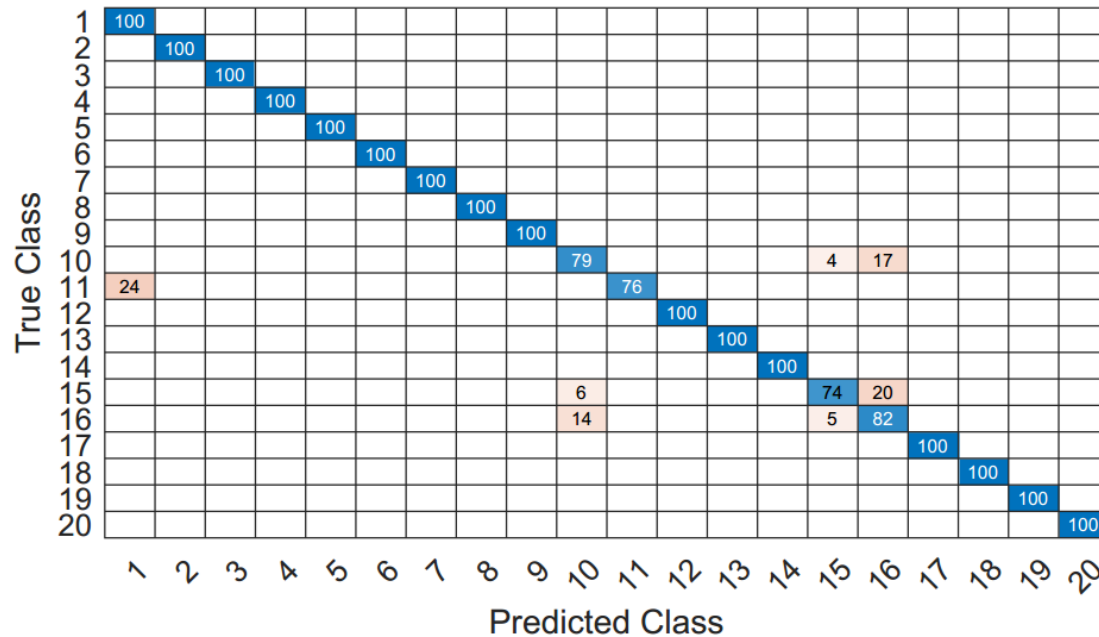
# Results of the classification with all devices

- 100 on/off events
- Low-pass filter (Kaiser window)
- Stop-band attenuation: 80dB
- Pass-band ripple is 0.01 dB
- The pass-band edge frequency is adjusted from 50 Hz to 5 kHz.
- Classification is realized using k-Nearest-Neighbor (k=3)

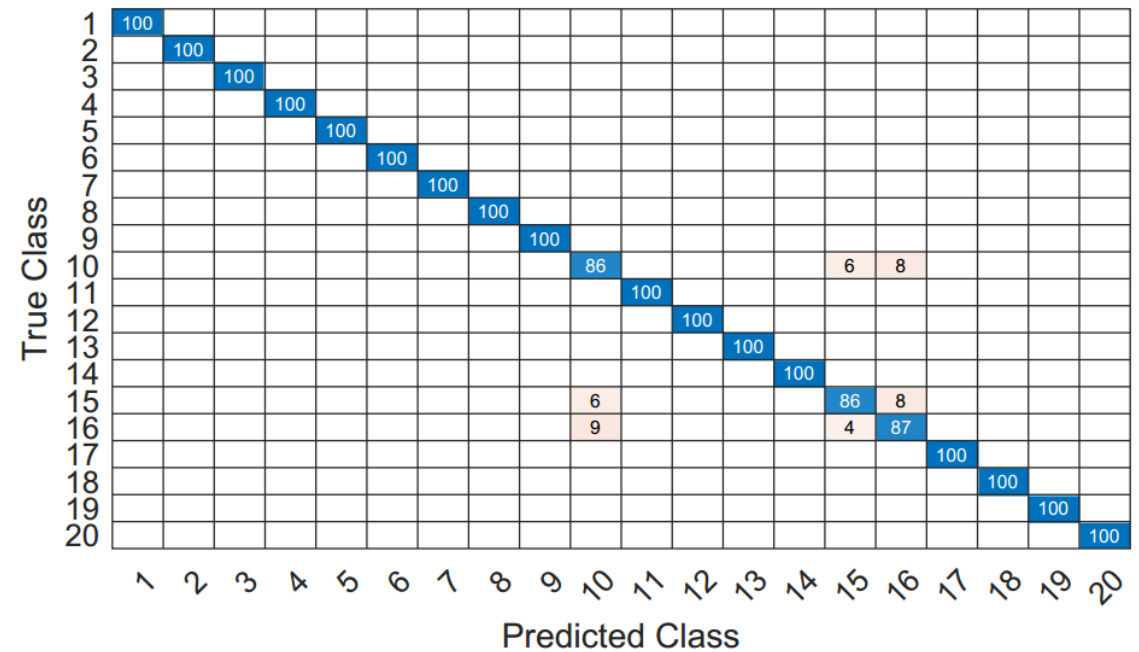


# Results of the classification with all devices

- Confusion matrix of the conventional current transformers at  $f_c=300$  Hz normalized to the amplitude

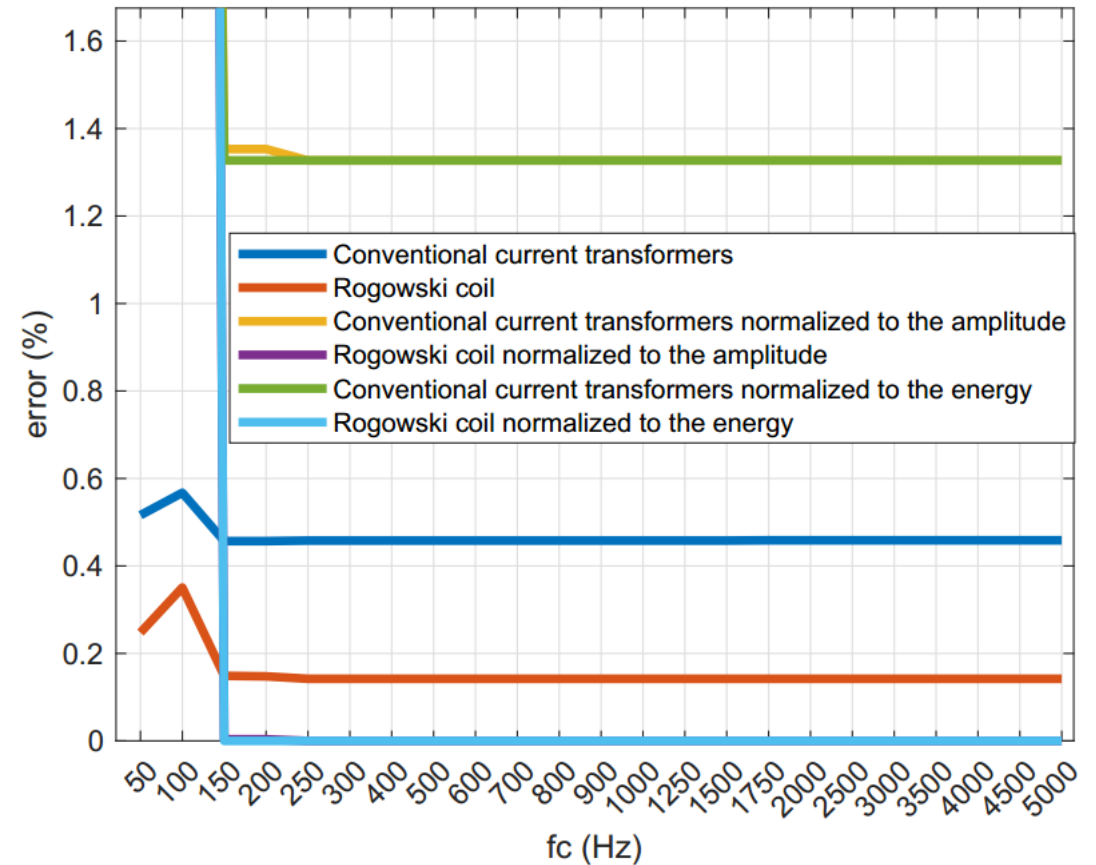


- Confusion matrix of the Rogowski coil at  $f_c=300$  Hz normalized to the amplitude



# Results of the classification without identical devices

- With the achieved results, the conventional current transformers mainly showed errors with the three identical fans.
- For this reason, only one of the three fans is used. Thus, 18 devices needs to be classified.
- The error with normalized features of the Rogowski coil is zero for frequencies equal or higher 250 Hz. The error of the conventional current transformer is with 1.3 % significantly higher.



# Thank you for your attention

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