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# Sensor data fusion for responsive high resolution ultrasonic temperature measurement using piezoelectric transducers

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1  
2 **Keywords**— ultrasonic instrumentation; ultrasonic non-destructive evaluation; ultrasonic oscillating  
3 temperature sensor; data fusion; temperature sensing; high resolution temperature measurement  
4  
5

## 6 ABSTRACT

7 Ultrasonic temperature measurement allows for responsive measurements across an entire ultrasonic  
8 pathway, unlike most conventional temperature sensors that respond to the temperature at the point of their  
9 placement only after a notable response time. The high cost of required ultrasonic instrumentation can be  
10 reduced substantially by using ultrasonic oscillating temperature sensors (UOTS) consisting of inexpensive  
11 narrowband piezo transducers and driving electronics. An UOTS produces sustained oscillations at a  
12 frequency that relates to the temperature of the medium between the transducers. The existence of thermal  
13 hysteresis in UOTS readings, observed experimentally and apparently related to the fundamental properties  
14 of piezoelectric materials, makes conversion of the output frequency readings to the temperature values  
15 ambiguous. This makes it complicated to calibrate and use UOTS on their own. In the reported experiment  
16 (heating, then naturally cooling of a water vessel equipped with both UOTS and conventional sensors), this  
17 hysteresis was solved by fusing UOTS data with conventional temperature sensor readings. As the result,  
18 the combination of one UOTS plus one conventional reference sensor allowed improving both the  
19 temperature resolution and responsiveness of the latter and ambiguity of the readings of the former. Data  
20 fusion effectively led to calibrating the UOTS at every change of the conventional sensor's reading,  
21 removing any concerns related to the thermal expansion/contraction of the ultrasonic pathway itself and/or  
22 hysteresis of piezoelectric transducers.  
23

## 24 1. Introduction

25  
26 *Why sense the temperature ultrasonically?*  
27

28 Temperature sensors are ubiquitously used in various consumer, domestic, transportation, and industrial  
29 applications. The global market value of these sensors was over US \$5 billion in 2016 [1]. Conventional  
30 temperature sensors are placed at specific location(s) where the temperature is to be assessed. They need to  
31 reach thermal equilibrium with the environment in order to produce accurate readings, and report their  
32 readings using a variety of interfaces. The cost of mass-produced temperature sensors varies from a few  
33 cents for thermistors with analogue output to up to a few dollars for better-specified sensors with standard  
34 digital communication interfaces. However, conventional sensors have some shortcomings, which originate  
35 from their operating principles. First, a conventional temperature sensor only operates at a single local  
36 point, making it necessary to deploy a set of sensors to estimate the average temperature in a room, a car, a

37 process vessel, etc. Second, any temperature changes in the environment require a certain amount of time  
 38 (called settling time or response time) to affect the sensor's readings. Third, the cost of high  
 39 accuracy/resolution sensors escalates very quickly.

40 Ultrasonic temperature sensors operate by propagating ultrasonic waves through the medium of interest,  
 41 and they produce readings based on the wave velocity's dependence on the temperature. As the waves  
 42 propagate several hundred meters per second in gases and several kilometres per second in liquids and  
 43 solids, ultrasonic sensors can potentially detect sudden temperature changes almost instantly. Sensor  
 44 readings are affected by the temperature profile along the entire ultrasound pathway; this results in  
 45 integrated (instead of local) temperature estimates. The possibility of using ultrasound for temperature  
 46 measurement was first reported in 1873 [2], and by 1975, approximately 500 industrial ultrasonic  
 47 thermometers, operating at temperatures ranging up to 20,000°C in gases, were sold [3]. Table 1 presents  
 48 several use cases in which ultrasonic temperature sensors demonstrated clear advantages over conventional  
 49 sensors.  
 50  
 51

Advantage	Application area	Length of the ultrasonic pathway	Quantification / Notes
Low measurement uncertainty	Healthcare / Hyperthermia	0.6 m	RMS noise of temperature readings of 5 $\mu$ K [4]
Measurement speed	Precision manufacturing / Small arms firing tests [5] Large caliber guns firing tests [6]	Contact measurement	Measurement interval of 1 ms [5] or 0.2 ms [6]
Measuring average temperature	Transportation / Car air conditioning	1 m	Obtained readings within $\pm 0.4$ K of a conventional single point sensor [7]
Temperature profiling	Metallurgy / hot billets [8] furnace [9]	Contact measurement on a probe	Multiple reflectors inserted into the probe
Heat flux measurement & temperature profiling	Materials science/ Hypersonic vehicle aero shell [10] Industrial materials [11]	Contact array [10] BAW or SAW [11]	Estimates obtained based on solving an inverse problem

52

53 Table 1. Examples of quantitative advantages of ultrasonic temperature sensors

54

55

56 Besides the general arrangements indicated above, ultrasonic thermometers may utilize pathways that  
 57 include reflections from single-zone or multi-zone reflectors, potentially useful for temperature profiling [8,  
 58 9]. (It should be noted that not only ultrasound but also acoustic waves in the audible frequency range could  
 59 be used for thermometry applications in large boilers [12].) In some measurement systems, whose primary  
 60 purpose is to sense a measurand other than temperature, for example, flow within a pipe or pipe integrity,  
 61 temperature still may be sensed as a by-product.

62 Among potentially interfering variables, one should consider the purity of the environment through which  
 63 ultrasonic thermometry pathways are utilized as any inclusions or contaminants could affect both the  
 64 ultrasound velocity and its temperature dependence.

65 As ultrasonic thermometers are considerably more expensive than conventional thermometers, their use  
 66 is currently limited.

67  
 68

### 69 *Development of ultrasonic oscillating temperature sensors*

70

71 Although temperatures can be estimated from time-of-flight (TOF) ultrasonic measurements [13, 14],  
 72 oscillating architecture has been identified as a potentially lower cost alternative [15]. Ultrasonic oscillating  
 73 temperature sensors (UOTSes) operate a pair of inexpensive mass-produced narrowband ultrasound  
 74 transducers in the through transmission mode, and they use a positive feedback loop to sustain oscillations  
 75 whose frequencies represent the sensor's output with the mechanism similar to that of acoustic feedback or  
 76 used in surface acoustic wave (SAW) oscillators. Fig. 1 presents a block diagram of an UOTS.  
 77

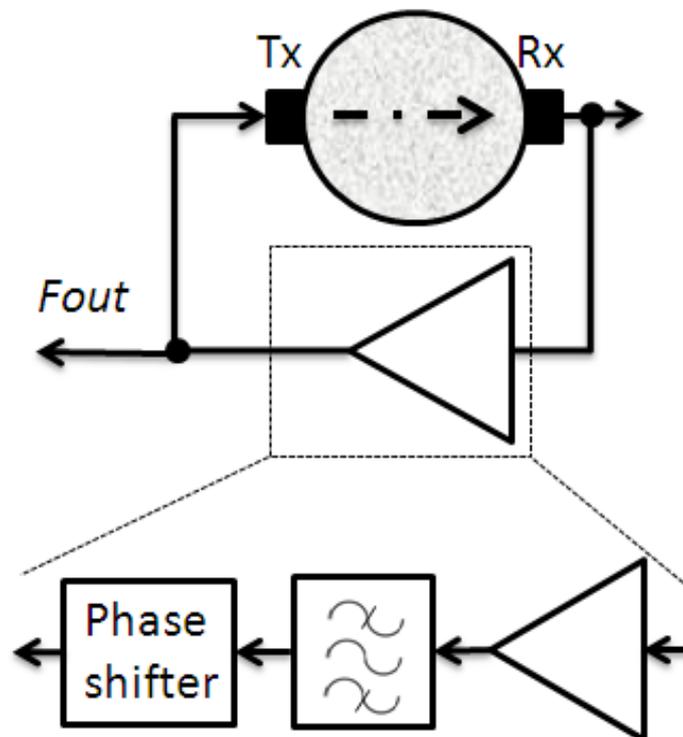


Fig.1. Block diagram of an UOTS [18]

78

79 The amplifier is required for compensation of all the conversion and transmission losses in the electrical and ultrasonic pathways, making the overall gain in the open loop greater than unity. The optional phase shifter enables tuning the sensor to a particular frequency at a required temperature as an UOTS oscillates at the frequency at which the overall phase shift in the open loop equals  $n \times 360^\circ$ ,  $n \in \mathbb{Z}$ . In order to limit oscillations to a particular frequency range, an optional band pass filter can be employed. Recently, our research group has focused on developing UOTSes with a low end-to-end cost that can be used in industrially-relevant conditions with as low instrumentation error as possible (Table 2).

86

Reference	UOTS center frequency	Approximate sensitivity	Length of the pathway	Comments
[15]	330 kHz	280 Hz/K	0.03 m	Consistency of UOTS output frequencies versus temperature at decreasing temperatures was reported
[14]	25 kHz	40 Hz/K	0.19 m	Different start up frequencies from the same UOTS in different experiments were observed
[16]	29 kHz	Tilt sensor	0.05 m	Reliable method to measure UOTS output frequency with any required resolution was presented
[17]	22 kHz	50 Hz/K	0.10 m	Implementation options for the electronic driver (including PSoC1*) were discussed
[18]	25 kHz	25 Hz/K	0.10 m	Comparison of ultrasonic thermometer architectures was conducted
[19]	46 kHz	60 Hz/K	0.10 m	Use of an UOTS for overnight measurements and observed hysteresis were reported
[20]	25 kHz	20 Hz/K	0.10 m	Simultaneous use of two UOTSes for the same process, modular design of the electronic driver, and thermal hysteresis for the recorded data were discussed
[21]	27 kHz	30 Hz/K	0.10 m	Differential temperature measurement using two UOTS was reported
[22]	27 kHz	30 Hz/K	0.10 m	UOTS and conventional temperature sensors were compared for a posteriori detection of the temperature extremum point

\*PSoC1 refers to the programmable systems on chip series 1 device, which is a highly versatile electronic part manufactured by Cypress Semiconductor.

## Table 2. Previous UOTS development

In our research group, the feasibility of building low cost, high resolution UOTS was confirmed at every stage of development. However, we found that the main obstacle to UOTS usability was the difference in their output frequency at the same temperature, depending on the sign of the temperature gradient (hysteresis). This phenomenon led to ambiguities as well as other complications when we attempted to convert the UOTS readings to temperature using a single calibration curve.

### *Hysteresis in piezoelectric transducers and the possibility of its mitigation*

Piezoelectric materials feature a strain/electric field hysteresis, which is dependent upon the ambient temperature [23]. Not being an issue of primary interest for most piezoelectric actuators, temperature-dependent hysteresis presented a significant challenge for manufacturers of precision oscillators. This problem was solved over time by improving the piezo materials, the temperature retention techniques and temperature-compensated devices [24]. We have recently presented several sets of UOTS experimental data obtained during heating/cooling cycles, which exhibited similar hysteresis [19-21].

It is worth noting that different readings at the same temperature, depending on the sign and/or magnitude of the temperature gradient, have been observed for low frequency UOTS as well as for high

110 frequency ultrasonic TOF measurement instruments [25] and low frequency ultrasonic oscillating tilt  
111 sensors [26].

112 Our numerous experiments with UOTS showed that, although thermal hysteresis was not random, it was  
113 very unpredictable from one experiment to another. The extent of hysteresis depended upon the past  
114 temperature values, and this complicated the development of a single calibration procedure that could, later,  
115 be confidently used with an UOTS on its own.

116 A similar behaviour was observed in a study of crystal oscillators, during which 720 temperature-  
117 frequency curves were experimentally collected and analysed [27]. Although the maximum differences in  
118 the oscillator's output frequencies at the same temperature were very consistent from one experiment to  
119 another [27, Fig. 4], the curves were found to be notably different [27, Fig. 3]. This study did not analyse  
120 the differences in the curves in detail because the primary interest of the authors was a specific measure of  
121 hysteresis, as defined by a military standard [28].

122 For this reason, we came to the conclusion that the development of usable UOTS could progress further  
123 with the aid of a conventional temperature sensor, which would constantly provide the reference data. The  
124 UOTS readings would be fused with these reference data when producing the temperature estimates from  
125 the UOTS readings. The following potential benefits of UOTS were expected to be sacrificed if this  
126 approach was used:

- 127 - The accuracy of the fused sensor could not be better than the accuracy of the reference sensor;
- 128 - There could be significant dynamic differences between the reference values and the UOTS readings  
129 because of the thermal inertia of the former;
- 130 - The reference values would come from a single point (or from only a few points if several  
131 conventional sensors were used), which might not be a good representation of the entire ultrasonic  
132 pathway.

133 Nevertheless, a fused sensor was expected to retain the following UOTS advantages:

- 134 - Fast detection of changes in the sign and/or magnitude of the temperature gradient;
- 135 - Increased resolution of temperature readings between the discrete values provided by the reference  
136 temperature sensor.

137 This paper describes a laboratory experiment related to external heating, followed by natural cooling of  
138 a water filled chamber, which was instrumented by several conventional temperature sensors and a UOTS.  
139 It also discusses the analysis of the recorded data and the removal of UOTS outliers, and describes the  
140 quantification of the observed thermal hysteresis and the developed data fusion procedure. It is concluded  
141 that UOTS enabled much faster detection of the temperature extremum point, which is useful for early  
142 prevention of thermal runaways and/or detection of process equipment failures. Simultaneous use of a  
143 conventional temperature sensor with an UOTS increased the resolution of the temperature readings,  
144 although some of the fused readings were found to be notably off, especially around the extremum point.  
145 We believe that was due to the thermal lag of the reference sensor.

## 146 147 148 **2. Experimental setup and procedure. Acquisition and preliminary processing of the sensor data**

149  
150 A transparent plastic tube, with a diameter of 0.1 m and a length of 0.5 m, was used as the experimental  
151 vessel. It contained the conventional temperature sensors, the UOTS, and a substantial amount of water  
152 (over 3.5 kg). The water acted as a thermal buffer to eliminate any sudden temperature changes in close  
153 proximity to the sensors that could otherwise affect their readings, thereby providing quasi-static changes  
154 of the temperature. The sides of the tube were sealed during the experiment. Eight DS18B20 One Wire®  
155 temperature sensors [29], encased in a stainless steel protective cover, were equidistantly placed at a cross-  
156 section of the tube close to its base. Four pairs of ultrasonic transducers were equidistantly placed at  
157 another cross-section at the centre of the tube. Another set of eight bare DS18B20 sensors were  
158 equidistantly placed close to the other base of the tube (Fig. 2). The distances between these cross-sections  
159 and the bases were kept approximately the same.

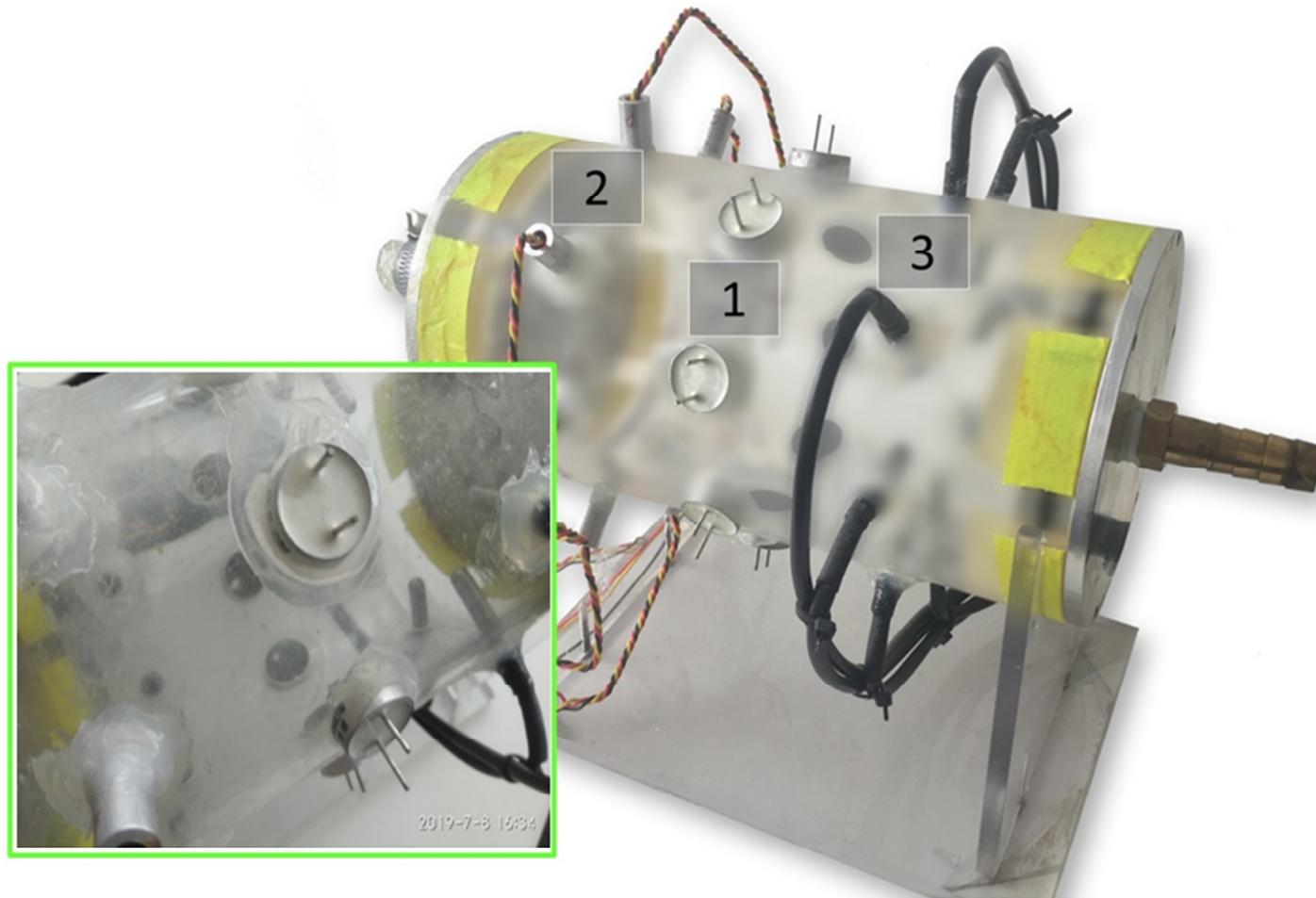


Fig. 2. Full view and close up photographs of the experimental vessel with the transducers labelled (1 - ultrasonic transducers, 2 - case less DS18B20, 3 - encased DS18B20)

162  
163 The UOTS was implemented by complementing one transducer pair with a modular ultrasonic driver  
164 [14], which consisted of two PSoC1 modules. One module was used for amplifying and band pass filtering  
165 the loop signal, and the other module was used to measure the UOTS output frequency and communicate it  
166 to the host via a suitable USB module. The output frequency was measured with the aid of an additional 10  
167 MHz oven controlled crystal oscillator (OCXO), which was the source of the reference pulses. We used  
168 OCXO because its tolerance and stability well exceeded those of the UOTS; a lower cost temperature  
169 compensated crystal oscillator (TCXO) could have been used instead, as discussed in [12, Section 3].

170 Each set of DS18B20 sensors was connected to a separate One Wire® bus. Only encased sensors were  
171 used in the experiment because their readings were found to be less scattered than the readings of the bare  
172 sensors. A separate PSoC1 based module was used to broadcast the "start measurement" command to all  
173 the encased sensors at the same time. It then collected their individual readings over the same bus by  
174 addressing them in turn. The sensor data, obtained for the same broadcasted "start measurement" command,  
175 were communicated to the host using a suitable USB converter as one data packet.

176 The experimental setup was placed inside a thermal chamber equipped with a thermostat (not used on  
177 this occasion), and it reached thermal equilibrium with the environment at 25.7 °C before the experiment  
178 began. Then, the chamber's built-in heater was switched on, heating its internal air, which, in turn, heated  
179 the experimental vessel. When the water in the vessel was increased by >3.5 K, the heater was switched off  
180 and the vessel started to cool down naturally, eventually returning to thermal equilibrium with the  
181 environment. Both the temperature and the UOTS readings, reported as text strings, were continuously  
182 saved into separate files by the host PC. The complete experiment took 4054 s.

183 Collecting a single set of data from the conventional temperature sensors and communicating it to the  
184 host took approximately 12.1 s; measuring and communicating a single UOTS output frequency took  
185 approximately 1.52 s.

186 Because the DS18B20 sensors used in this experiment were not individually calibrated by the  
187 manufacturer, and, additionally, they were encased, some of the readings varied from one sensor to another.  
188 For example, when the temperature increased, the sensors produced the next higher discrete output value at  
189 different times. This observation can be attributed to the varied thermal biases specific to different sensors  
190 and uneven temperature distribution inside the tube. On the positive, these factors allowed averaging the  
191 temperatures across the sensor array. (It would be meaningless to average these digital readings if they  
192 were all the same at all times.) When the average temperatures over time were calculated, standard  
193 deviations (STDs) were computed for each sensor. The STDs of six sensors were found to be similar, and  
194 the STDs of the other two sensors were approximately 50% higher. We decided to exclude the latter two  
195 sensors from further consideration, and recalculated the average temperatures over time for the six selected  
196 sensors. Fig. 3 presents the average temperatures along with the readings recorded for a single sensor,  
197 which readings tracked the average temperature most closely, and that was later used as the reference  
198 sensor for the data fusion, for comparison. It can be seen that the averaging allowed for smoothing the  
199 stepwise digital readings of the individual sensors.

200 In order to quantify UOTSes hysteresis, the raw temperature data set needed to be interpolated to the  
201 same points in time at which the UOTS output frequencies were measured. We used spline interpolation for  
202 the average temperatures. The sensor 2 readings were assumed to be identical to the readings obtained  
203 before the experiment and up to the moment when a different value was recorded; from that moment, the  
204 readings were assumed to be equal to the new value until the value changed again. The interpolated average  
205 temperatures are presented as a dotted line in Fig. 3.

206 The recorded UOTS output frequencies exhibited some intermittent jumps away from the smooth trend  
207 line, returning to the trend over time (Fig. 4).  
208

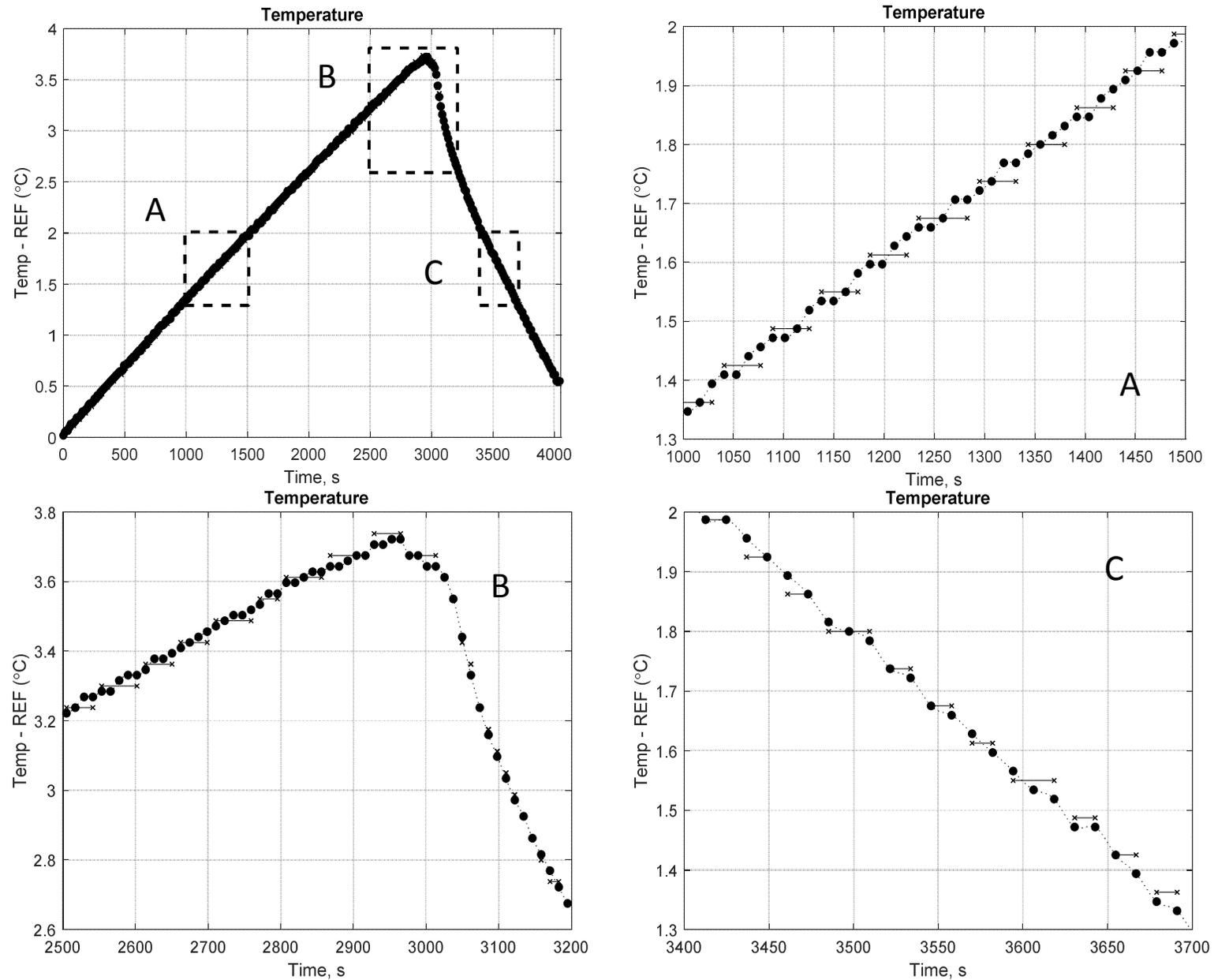


Fig. 3. Average temperature (dots), reference sensor readings (stepwise solid line), and spline interpolated average temperature (dotted line) presented for the complete experiment (top left pane) and heating, maximum temperature and cooling stages (A, B and C panes respectively). The reference temperature was 27.5 C.

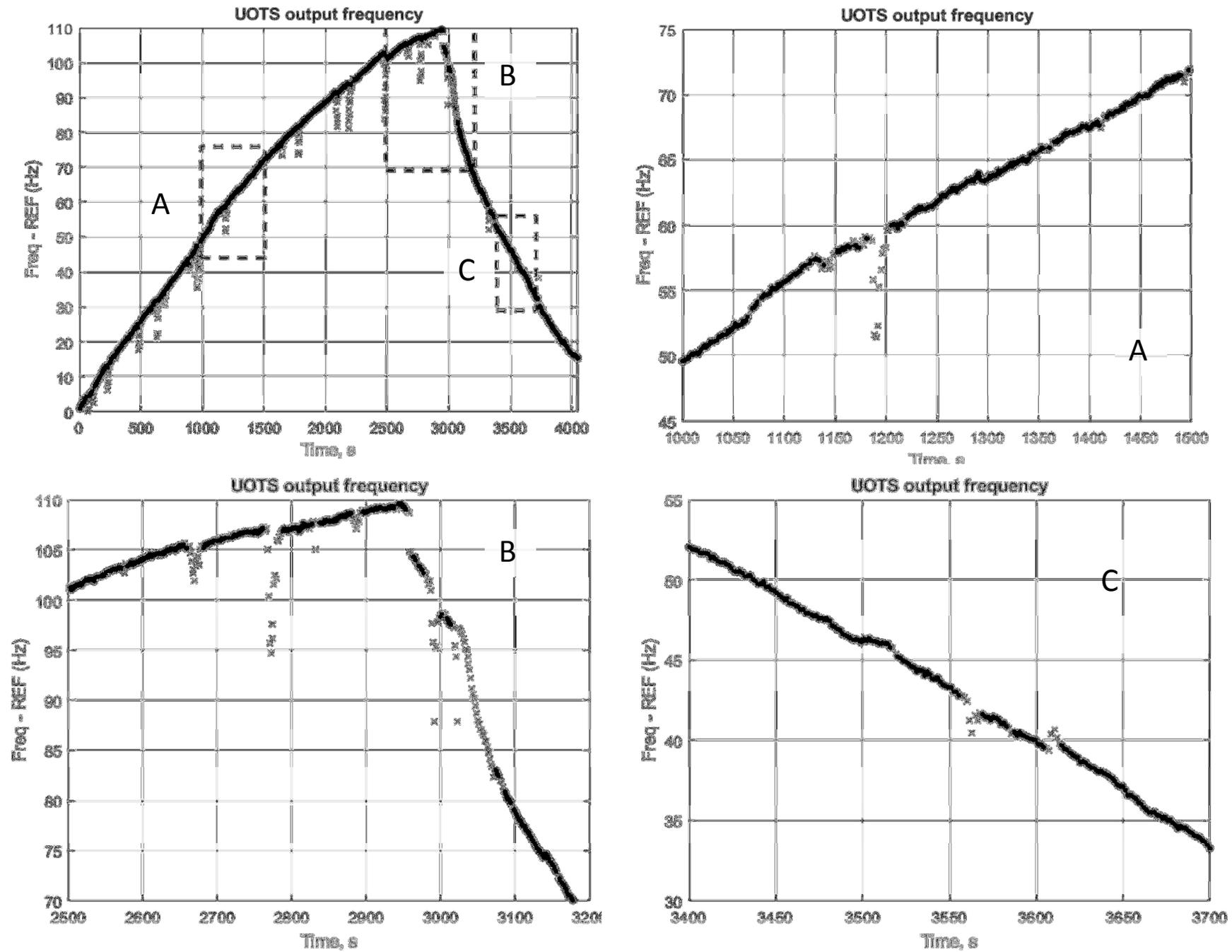


Fig. 4. Recorded (crosses) and accepted (dots) UOTS output frequencies presented for the complete experiment (top left pane) and heating, maximum temperature and cooling stages (A, B and C panes respectively). The reference frequency was 27,168 Hz.

Such behaviour was observed for various UOTS in spite of the continuing refinement of the electronic instrumentation. The magnitudes of the jumps, typically in the order of a few Hz or about 0.01% of the output frequency, would be considered acceptable for a majority of crystal-less oscillators. For example, the frequencies of the internal oscillators of modern microcontrollers are commonly specified to be within  $\pm 1\%$  tolerance of their nominal frequency, and they are very sensitive to ambient temperature. Nevertheless, a change of only 0.3 Hz with a typical UOTS sensitivity of 30 Hz/K would correspond to a sudden change of temperature by approximately 0.1 K. Although these jumps might have been influenced by some heat exchange phenomena in liquids, a safer explanation would relate the jumps to the collective influence of random factors, which temporarily and intermittently shifted the UOTS loop out of the steady state. We eliminated most of these jumps, assuming that the UOTS readings would not change too rapidly from one reading to another due to the significant specific heat capacity of water. Fig. 5 presents a graphic representation of the acceptance criterion: every recorded output frequency reading was compared to its three neighbors from each side.

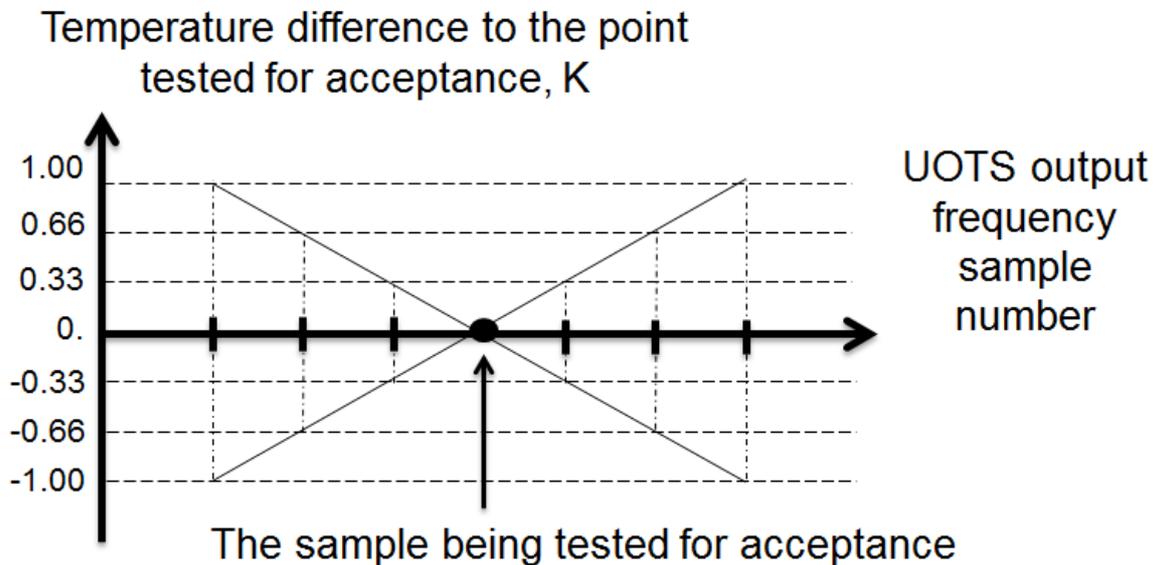


Fig.5. Acceptance criterion for the recorded UOTS output frequencies

As shown, all of the output frequencies are within the allowed boundaries for the considered frequency reading to be accepted. These boundaries were selected by trial and error to achieve some balance between removing the outliers while retaining the valid data despite the fact that it was slightly noisy; using this criterion, 77.8% of the recorded measured points were retained.

### 3. Quantification of the observed temperature-dependent hysteresis

The existence of hysteresis becomes very clear if the experimental data for frequency and temperature versus time are plotted on the same graph using appropriate scaling (Fig. 6).

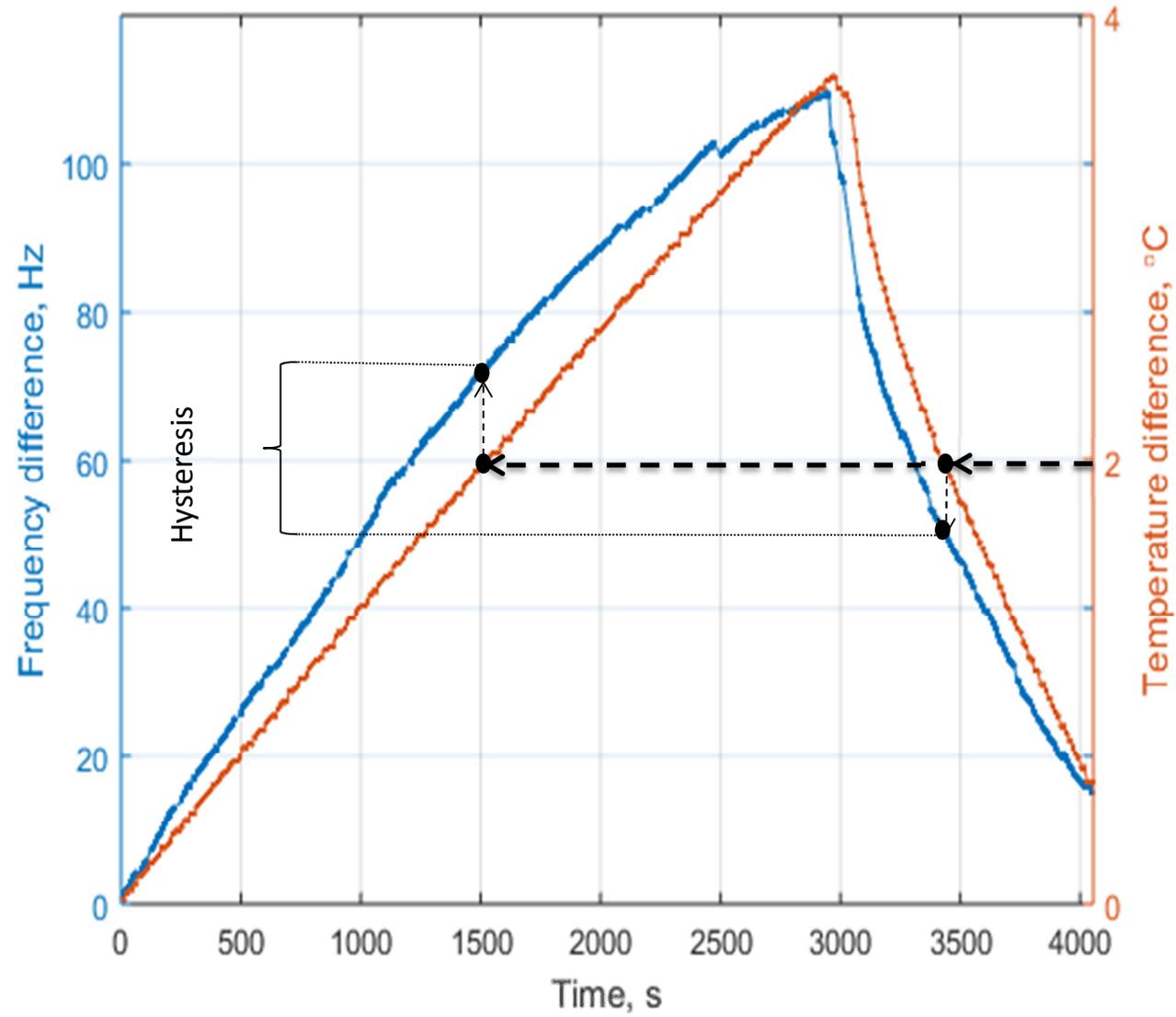


Fig.6. Experimental data for the UOTS output frequency and average temperature vs. time plotted on the same graph using appropriate scaling.

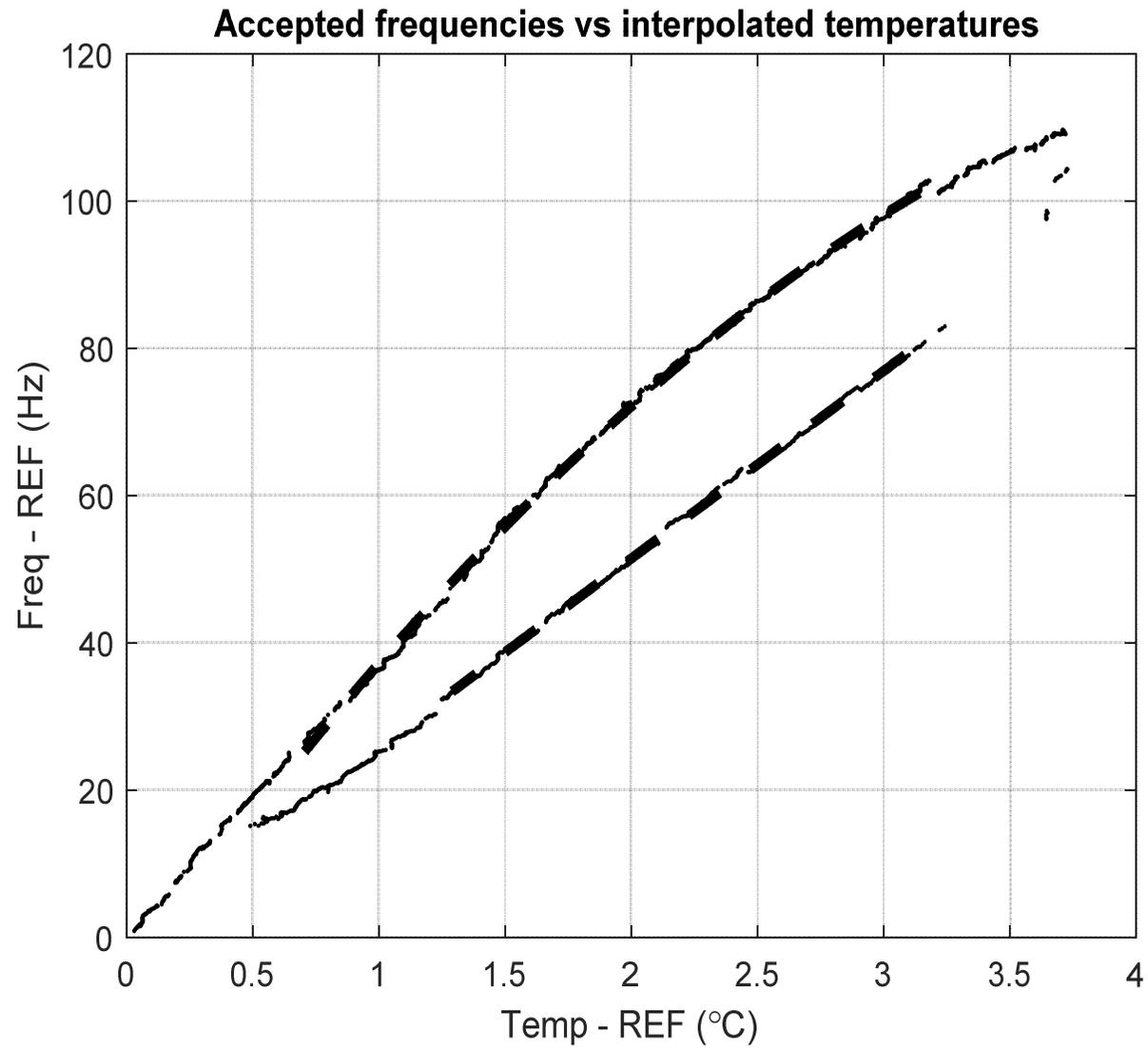


Fig.7. Accepted UOTS output frequencies versus temperature differences (dots), their approximations at the heating and cooling stages (thick dashes).

241 For any temperature difference of interest, one can find two associated points at the temperature curve and  
 242 determine that, at the heating stage, the corresponding frequency is located above the temperature curve,  
 243 while at the cooling stage the corresponding frequency is located below the curve. This results in a  
 244 considerable temperature difference. UOTS output frequency versus interpolated average temperature is  
 245 graphed in Fig. 7.

246 As seen, the UOTS sensitivities were very different at the heating and cooling stages of the experiment.  
 247 From the information presented in the graph, it seems that, at the temperature extrema point, some of the  
 248 physical properties of the UOTS exhibited a step change similar to the changes observed for crystal  
 249 oscillators [24, 28]. As we observed experimentally on several occasions, the hysteresis of the UOTS  
 250 sensitivities at the heating and cooling stage could vary significantly, depending on the history of the  
 251 temperature changes before the most recent temperature extremum. This phenomenon makes it very  
 252 difficult to calibrate an UOTS. Thus, it is necessary to use an additional conventional temperature sensor as  
 253 the reference in order to convert the UOTS readings into temperatures.  
 254  
 255  
 256

#### 257 **4. Sensor data fusion procedure**

258  
 259 The data fusion procedure that we developed was based on a first order approximation of the UOTS  
 260 output frequency ( $f$ ) versus ambient temperature ( $T$ )  
 261  
 262

$$263 \quad T = T_0 + \left[ \frac{\Delta T}{\Delta f} \right]_0 (f - f_0), \quad (1)$$

264  
 265 where subscript 0 relates to the most recent moment in time when the reference sensor data were used to  
 266 numerically estimate the gradient. For this estimation, the recorded temperature and the UOTS output  
 267 frequency are saved as the present values every time the digital reading of the reference sensor changes,  
 268 and the previously stored frequency and temperature values are moved to the past values storage with the  
 269 subscript -1, as shown in Fig. 8.  
 270  
 271

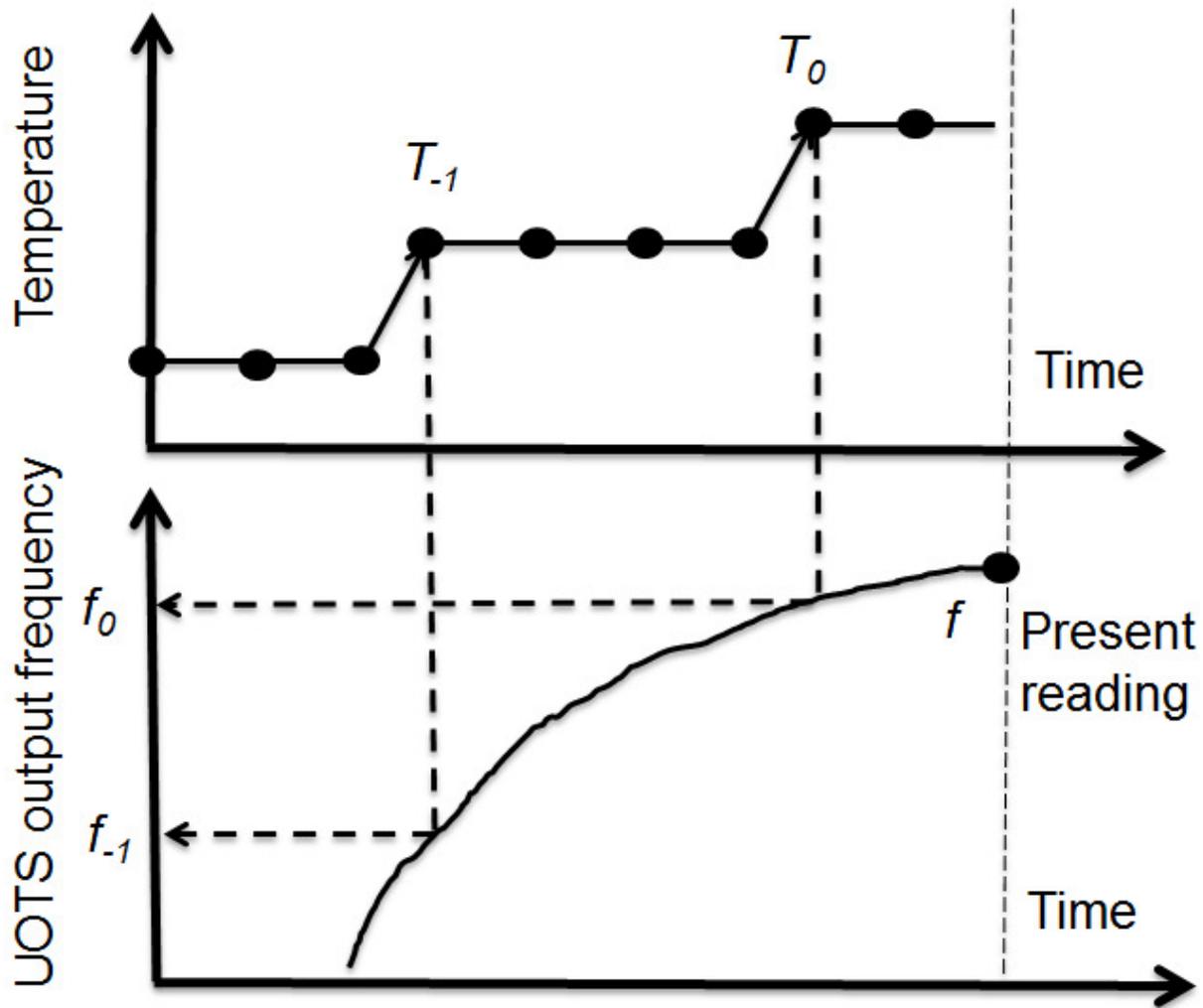


Fig.8. Definition of the experimental readings used for the numerical assessment of the gradient for the frequency/temperature relationship.

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Then, the gradient is estimated numerically from the experimental values as follows:

$$\left[ \frac{\Delta T}{\Delta f} \right]_0 = \frac{T_0 - T_{-1}}{f_0 - f_{-1}}$$

(2)

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The fused temperature estimates are presented in Fig. 9 along with the sensor 2 readings that were used for the data fusion.

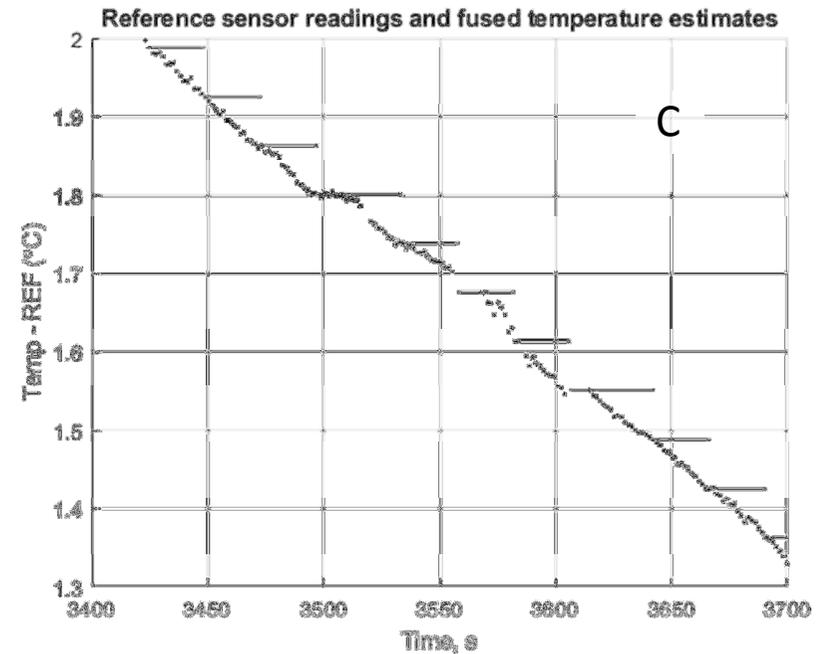
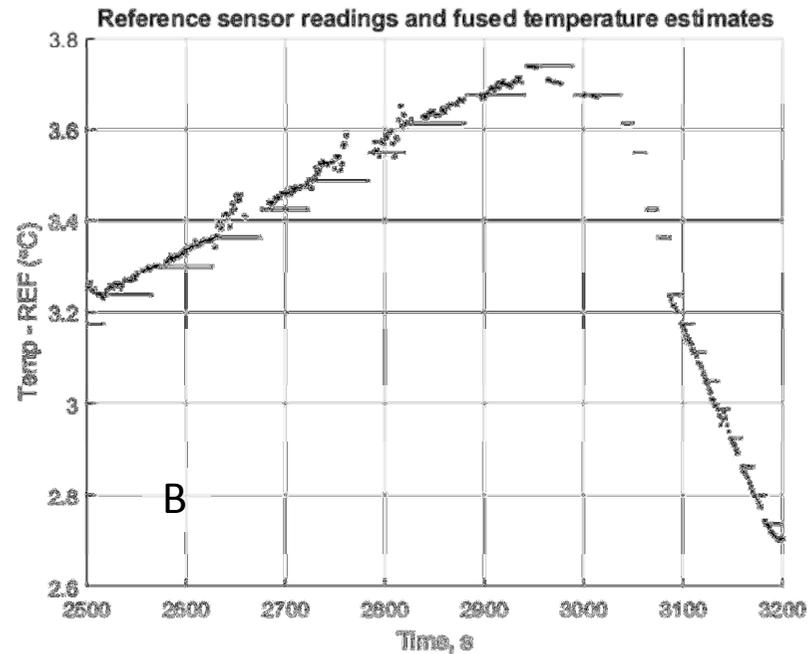
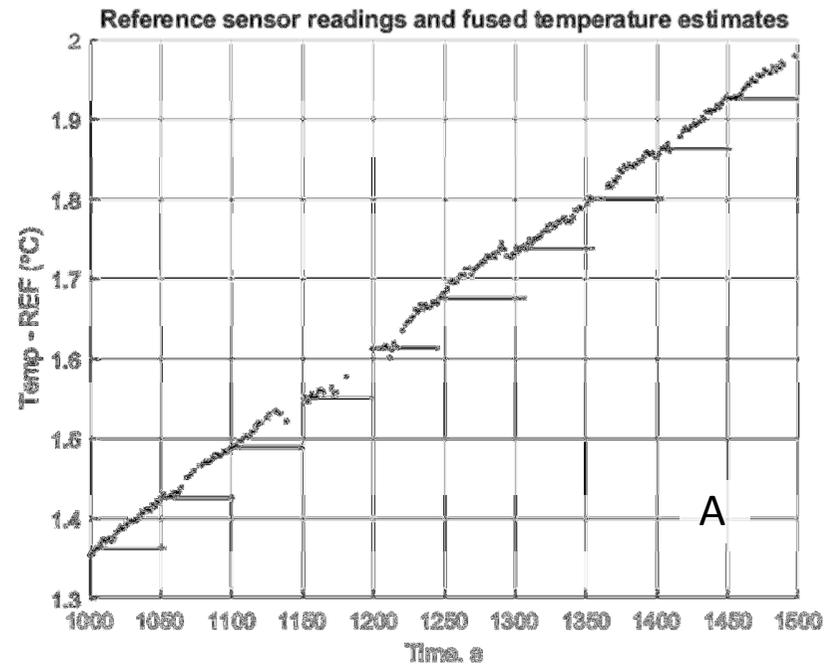
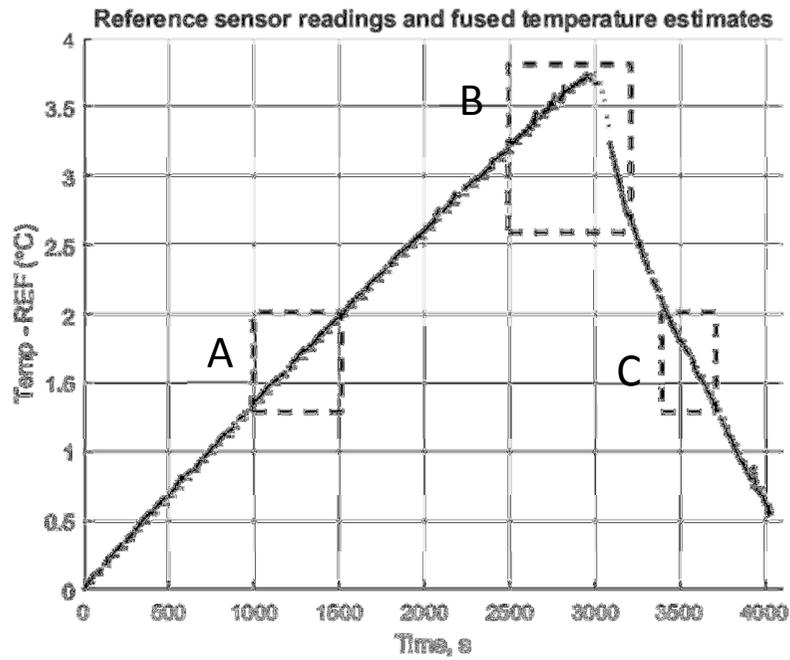


Fig.9. Fused temperature estimates (dots) and stepwise readings of the reference sensor (solid lines) presented for the complete experiment (top left pane) and heating, maximum temperature and cooling stages (A, B and C panes respectively). The reference temperature was 27.5 C.

The estimates did feature some outliers around the temperature maximum point as one would expect, because the readings of the reference sensor notably lagged the temperature. However, for the most part, the UOTS fused data did make sense, allowing clear increases in the resolution of the reported temperature.

## 5. Summary and conclusions

Realizing the potential advantages of UOTS (fast response time, sensing temperature over the complete pathway and higher resolution), is complicated by the existence of thermal hysteresis in piezo materials. Consequently, UOTS readings at the same temperature vary significantly depending on the sign of the temperature gradient and the past temperature history. Moreover, even the UOTS output frequency's sensitivity to temperature varies, further complicating UOTS calibration.

We conducted an experiment that subjected a set of conventional temperature sensors and an UOTS to a quasi-static heating-cooling cycle to quantify the UOTS hysteresis and to explore the feasibility of fusing the data reported by the UOTS and one conventional sensor.

Outliers in the recorded UOTS output frequency were removed by limiting the allowed rate of the output frequency change to around  $0.3 \text{ Hz} / 1.5 \text{ s} = 0.2 \text{ Hz/s}$  for six readings in close proximity to the reading being tested for acceptance. This acceptance criterion allowed us to retain 77.8% of the recorded output frequencies while automatically removing most of the clear outliers.

The data fusion procedure was used to overcome thermal hysteresis of UOTS. The estimate for the gradient of the UOTS output frequency versus temperature was recalculated every time the digital reading of the reference temperature sensor changed, and it was later used to convert UOTS readings into temperature estimates. Although this procedure resulted in losing some of the advantages of UOTS, it did enable temperature resolution increases and response time decreases in comparison to using a conventional temperature sensor alone.

Data fusion allowed overcoming dependence of UOTS readings on the ultrasonic path length and properties of the medium under test (like density, purity *etc*), and their dependence on the temperature. That was because any UOTS readings became referenced to the temperatures, measured by the conventional temperature sensor.

Overall, UOTS have been shown to be a potentially valuable addition to process control instrumentation. They allowed an improvement in the resolution of the fused temperature estimates and their responsiveness in comparison to a conventional temperature sensor alone. On the downside, UOTS feature intermittent frequency jumps that could lead to out-of-the range estimates if a suitable acceptance analysis is not conducted on the raw data. The developed data fusion procedure is applicable to the UOTSes only.

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