Abstract—Environmental variables monitoring with wireless sensor networks (WSNs) is invaluable for precision agriculture applications. However, the effectiveness of existing low-power, conventional (e.g. ZigBee-type) radios in large-scale deployments is limited by power consumption, cost and complexity constraints, while the existing WSN solutions employing non-conventional, scatter-radio principles have been restricted to communication ranges of up to a few meters. In this paper, the development of a novel analog scatter-radio WSN is presented, that employs semipassive sensor/tags in bistatic topology (i.e. carrier emitter placed in a different location from the reader), consuming less than 1 mW of power, with communication range exceeding 100 m. The experimental results indicate that the multipoint surface fitting calibration, in conjunction with the employed two-phase filtering process, both provide a mean absolute error of 1.9% environmental relative humidity (%RH) for a temperature range of 10-50 °C. Moreover, the energy consumption per measurement of the proposed environmental monitoring approach can be lower than that of conventional radio WSNs. Finally, the proposed approach operational characteristics are presented through a real-world network deployment in a tomato greenhouse.

Index Terms—scatter radio communication, precision agriculture, backscatter sensor networks, environmental monitoring.

I. INTRODUCTION

Wireless sensor networks (WSNs) have attracted great academic and industrial attention, with various applications ranging from environmental sensing and wearable biometric monitoring to security and structural monitoring [1]–[5], that perhaps realize the “Internet of Things” concept. Despite the fact that a lot of algorithm- and networking-related research has been conducted regarding large-scale WSNs (e.g. work in [6]–[10]), only few examples of real-world large-scale deployments exist in the literature. For example, work in [11] demonstrated a network of a few hundreds of nodes and described the scale-vs-lifetime tradeoff. In that work, the cost of each sensor was approximately 36 €. Apart from the lifetime and cost constraints, software complexity has also been indicated as a major limiting factor for WSN scalability [12].

In order to address these constraints and promote network scalability, systems have emerged that utilize communication by means of reflected (and scattered back) radio frequency (RF) power; such concept has its roots back in the 1948 [13]. The most popular system of this technology is the radio frequency identification (RFID) tag, which is commercially utilized as a barcode-replacement for identification of objects or individuals.

In principle, backscatter communication is implemented with a RF switch (e.g. a single transistor) that alternates the termination load of an antenna between two (or more [14]) loads. As depicted in Fig. 1, if the antenna load termination is alternated with frequency $F_{sw}$ while a continuous wave (CW) with frequency $F_c$ is incident on the antenna (and

\[ F_c - F_{sw} \quad F_c \quad F_c + F_{sw} \]
Fig. 3: Sensor circuit diagram with scatter-radio: capacitance varies the timer output frequency, producing a variable-frequency pulse that switches a single transistor; the latter is directly connected to the antenna.

produced by a distant emitter), then two subcarriers will emerge in the frequency spectrum, at frequencies $F_c \pm F_{sw}$. The RF front-end of such backscatter-enabled tag, can be implemented with minimal number of simple electronic circuit components, greatly reducing cost and complexity per tag, and thus, enabling large-scale deployments. The design of a frequency-modulated passive wireless sensor tag for ammonia sensing has been presented in [15], but its operation within a WSN structure has not been explored.

Classic battery-less RFID systems utilize monostatic architectures (i.e. reader in the same box as the carrier emitter) and incorporate high bitrate schemes that greatly reduce the communication range down to a few meters [16]. On the other hand, environmental monitoring WSNs do not require either battery-less setups or high bitrates, since environmental variables, such as relative humidity (%RH) and temperature, change with a slow rate. With the utilization of the bistatic topology, illustrated in Fig. 2, where the carrier emitter is placed in a different location from the reader, the roundtrip path losses can be reduced, especially when more than one low-cost emitters illuminate the population of the tags (and thus, the probability of a short distance between emitter and tag is relatively high, for given tag-to-reader distance) [17]. Additionally, employing low bitrate increases the sensitivity of the receiver (reader) [18]. Finally, in order to avoid powering issues at the tag, each sensor/tag can be equipped with batteries (or other independent energy source e.g. a solar panel) [18]; in that way, more energy from the incoming wave can be reflected towards the reader, instead of using a fraction of the incoming energy to power the tag/sensor’s electronics. The aforementioned techniques are utilized in [19], where tag-to-reader ($d_{tr}$) and emitter-to-tag ($d_{et}$) distances of over 134 m and 4 m, respectively, were demonstrated, with bit-error-rate (BER) on the order of 2%, frequency-shift keying (FSK) modulation, emitter power at 13 dBm, commodity software-defined receiver and carefully-designed non-coherent detection algorithms. Other examples in the literature that demonstrate the potential of backscatter radio for wireless sensor networking can be found in [20], [21]. Moreover, a recent example of real-world deployment includes [22], in which the authors developed a scatter-radio sensor network that monitors ambient relative humidity (%RH), while an experimentation testbed for developing and optimizing backscatter-based WSNs was presented in [23].

Relative humidity (%RH) is an environmental variable that greatly affects growth of plants. Thus, it is particularly useful to monitor %RH variation across extended areas in either outdoor fields or greenhouses. Increased values of %RH can promote the growth of various bacteria such as Botrytis [24], or decrease the plant’s mineral intake [25]. There are numerous implementations of low-power %RH sensors in the literature, (e.g. work in [26], [27]), which however do not employ any wireless interface for transmitting information. On the other hand, passive wireless sensors have been used in [28], [29] for data transmission. However, these utilize inductive coupling techniques, which inherently limit the communication range to a few centimeters. Finally, classic WSNs for environmental monitoring have been presented in the literature [30]–[32], employing active IEEE 802.15.4 / ZigBee compliant, conventional RF transceivers, but their operation is limited due to power, complexity and cost constraints, discussed above.

In this paper, the design of an analog scatter-radio WSN is presented, which facilitates large-scale deployment of low-cost and low-power relative humidity sensors. In contrast to existing scatter-radio sensors with short communication range, this work utilizes bistatic topology and semi-passive (i.e. energy-assisted) tags that offer ranges on the order of 130 meters. The contribution of this work is summarized as follows:

- Design and fabrication of prototype %RH sensing tags, with off-the-shelf components, that exploit analog frequency modulation (FM), scatter-radio and sensor networking principles.

Fig. 4: The prototype sensor tag developed.
• Calibration and accuracy-characterization procedure of the developed sensor tags by taking into account not only humidity, but also temperature for the calculation of the sensor's characteristic function.

• Receiver design and implementation with a commodity software-defined radio (SDR) platform for the demodulation of the FM signals, backscattered by the tags.

• Data smoothing, exploiting a two-phase filtering process that actively increases the signal-to-noise ratio (SNR) at the reader and thus, offers longer communication ranges.

• Range characterization of point-to-point links through outdoor experimentation.

• Real-world deployment of a 10-sensor WSN for monitoring %RH in a tomato greenhouse at the Mediterranean Agronomic Institute of Chania, Crete (MAICh).

This paper is organized as follows: the development of the analog wireless sensor is described in Section II, design and operation of the software-defined receiver are analyzed in Section III and experimental results are presented in Section IV. Work is concluded in Section V.

II. ANALOG WIRELESS SENSOR DESIGN

A. Description

The proposed WSN consists of low-power and low-complexity analog wireless sensors, which operate with scatter-radio principles. The circuit diagram and the prototype sensor/tag\(^1\) which was developed, are depicted in Figs. 3 and 4, respectively. The sensor driving circuit is a capacitance-to-frequency converter with its output connected to a radio frequency (RF) switch; the latter consists of a single transistor. For the capacitance-to-frequency conversion, the Intersil 7555 timer IC is utilized and it has been configured to operate in an astable multivibrator mode. The timer IC is connected to a resistor-capacitor (RC) network that contains the Honeywell HCH1000 capacitive relative humidity (%RH) sensor (i.e. \(C_{RH}\) in Fig. 3).

The RH sensing capacitor is periodically charged and discharged through resistors \(R_1\) and \(R_2\) (Fig. 3). Thus the frequency \(F\) and duty cycle \(D\) of the square wave produced at the output of the astable multivibrator are given by:

\[
F = \frac{1}{(R_1 + 2R_2)C\ln(2)} \quad (1)
\]

\[
D = \frac{R_1 + R_2}{R_1 + 2R_2}. \quad (2)
\]

It is noted that \(D\) is always over 50% since \(R_1 > 0\). Therefore, the proposed design produces a scatter-radio subcarrier (i.e. switching) frequency, which is dependent on the relative humidity value when a CW is incident on the antenna. In order to adjust the total capacitance range of the sensor tag, capacitor \(C_p\) is connected in parallel with the sensing capacitor. Thus, the total capacitance \(C\) is given by:

\[
C = C_p + C_{RH}. \quad (3)
\]

The RF front-end of the sensor tag consists of a single depletion-type MOSFET transistor, a low-pass filter and an antenna (implementation details in [33]). The NXP BF1118 transistor with a \(V_p = -2\) V pinch-off voltage is used due to its low-cost, low gate-to-source leakage current (100 nA), high off-state isolation (30 dB) and low on-state insertion loss (below 2.5 dB). In order to turn the transistor “off”, its gate is permanently connected to the ground and the voltage pulses from the timer, drive the MOSFET source. Therefore, when timer OUT pin is “high”, the MOSFET gate-source voltage is set at \(V_g = -2\) V and the transistor is turned “off”, else it is turned “on”. Moreover, for decoupling the RF front-end from the timer circuit, an inductive filter bead has been utilized.

The components used to construct the prototype sensor/tag were selected such that a balance between cost, power consumption and performance is preserved. Using off-the-shelf electronic components, resulted in the relatively low cost in terms of bill of materials (BOM) of 5 € per tag, without
including the SMA antenna connector, since the antenna can be easily integrated within the tag circuitry.

The wireless sensor design described above can be easily adapted for hosting alternative types of capacitive or resistive sensors for measuring environmental variables of interest (e.g. ambient temperature, water soil content, soil temperature etc.).

B. Multiple Access from Receiver-less Sensors

In order for multiple tags to be able to communicate with the receiver, a medium access control (MAC) scheme was implemented. As noted above, each tag produces a subcarrier with an operating frequency that is related to the %RH value. In order for multiple receiver-less tags to be able to communicate simultaneously with the receiver, each tag of the network operates in a different frequency band [18], [34]. The concept is depicted in Fig. 5, where a specific frequency band is allocated for each tag, while guard-bands are also employed between adjacent bands in order to avoid collisions. This scheme, namely frequency division multiple access (FDMA), is also utilized in analog FM radio, where each radio channel accounts for a specific frequency [35].

The architecture of the proposed WSN is illustrated in Fig. 6. Low-cost emitters of the carrier CW are installed in a field and around them, multiple, scatter-sensors are spread. When the emitters are activated, cells are formed around the field and around them, multiple, scatter-sensors are spread.

Fig. 7: Experimental example: the subcarrier frequency shift of three sensors with change in %RH.

humidity changes from 20 % to 40 %, while, simultaneously, signal collision is avoided.

The FDMA medium access scheme of the proposed WSN is implemented by selecting the appropriate component values for the RC network of the timer in each individual tag, such that the center frequency and the total spectrum occupied by the corresponding tag are unique. Particularly, the spectrum band occupied by the i-th tag depends on the highest and lowest subcarrier frequency \( F_{hi} \) and \( F_{li} \), respectively. Using (1), the total bandwidth \( B_i \) for the i-th tag is calculated according to the following equation:

\[
B_i = F_{hi} - F_{li}
\]

\[
\begin{align*}
B_i &= \frac{1}{R_i(C_L + C_{pi})\ln(2)} - \frac{1}{C_H - C_L}
\end{align*}
\]

\[
R_i = \frac{1}{\ln(2)R_i(C_L + C_{pi})(C_H + C_{pi})},
\]

where \( R_i = R_{1i} + 2R_{2i} \) and \( C_L \) and \( C_H \) are the sensing capacitance values for 0 %RH and 100 %RH, respectively. The values of \( R_i \) and \( C_{pi} \) are calculated using (1) and (4), as follows:

\[
C_{pi} = \frac{B_iC_L + F_{li}(C_H - C_L)}{B_i},
\]

\[
R_i = \frac{B_i}{\ln(2)F_{li}(C_H - C_L)(F_{li} + B_i)}.
\]

Using the above methodology, the proposed implementation of collision-free access from multiple, receiver-less, analog sensors becomes straightforward.

C. Calibration & Accuracy

Target applications of the proposed WSN include environmental monitoring in outdoor deployments. It is important to note that the outdoor environment temperature variations
significantly affect the operation of the electronic circuits within the sensor tag. As an example, the 7555 timer exhibits a temperature drift of 150 ppm/°C and, thus, for a tag with nominal subcarrier frequency 50 kHz, a total change of 15° C results to a frequency shift of 112.5 Hz. Considering that a typical tag occupies a bandwidth of 2 kHz, the aforementioned frequency shift amounts to 5.625% of the tag’s bandwidth and a %RH error of the same order (in percentage). In order to compensate for this effect, a calibration process is employed, considering both the ambient temperature and the sensor tag subcarrier frequency as input parameters.

Specifically, groups of five sensors were placed outdoors with their capacitive elements in adjacent positions. The Tinytag TGP-4500 from Gemini, which is a high-precision industrial humidity/temperature data-logger, was also placed in close proximity with the tags, for reference. The system was deployed to operate for 3 days and each sensor’s subcarrier frequency was monitored at the reader, as analyzed next, while temperature and humidity from the reference sensor was logged every minute. A total of 4200 samples were collected and time-synchronized, using the timestamps from both the data-logger and the reader. Subsequently, polynomial surface fitting was applied in order to produce the calibration function, which is shown in Fig. 8. Due to the tolerance of the capacitance/resistance of commercial components, which affects the operating frequency of the timer, the calibration procedure described above should be applied for each sensor node before incorporation in the proposed WSN.

The measurement accuracy was characterized as follows: the collected subcarrier frequency and temperature data were utilized as inputs for the calibration function and the results were then compared to the reference measurements. The resulting relative humidity measurement error histogram and measured values are depicted in Figs. 9 and 10, respectively, operating a reference sensor and the calibrated tag in the 10-50° C temperature range. The root mean squared error (RMSE) and the mean absolute error of the particular calibrated tag were 2.5 %RH and 1.9 %RH, respectively. Also, for 95% of the samples, where humidity varied from 20 %RH to 100 %RH, the absolute error was less than 5 %RH. For the case of tag calibration under constant temperature of 25 °C, the corresponding accuracy was higher, exhibiting an RMSE of 0.86 %RH and a mean absolute error of 0.63 %RH. Similarly, for 95% of the samples at 25 °C, the absolute error was less than 1.8 %RH.

D. Power Consumption & Tradeoff

As depicted in Fig. 3, each sensor is power-supplied through a voltage reference integrated circuit (IC) and two Schottky diodes, in common cathode configuration. Each of the diodes is connected to a different power source; a small solar panel with an open-circuit voltage of 3.5 V and a 3 V lithium-ion battery (type CR2032), respectively. The diodes act as a logic ‘OR’ and allow current to flow from the source with the largest voltage potential to the tag circuitry. Thus, the sensor powersupply alternates between battery and solar panel during night and day, respectively.

The tag operates from an input voltage of \( V_{cc} = 2.26 \) V and its total power consumption is given by:

\[
P_{tot} = P_{ch} + P_{q} + P_{R1} + P_{d},
\]

where \( P_{ch} \) is the average power required for charging the timer capacitors, \( P_{q} \) is the quiescent power dissipated by the timer and the voltage reference IC, \( P_{R1} \) is the power dissipated on resistor \( R_1 \) and \( P_{d} \) is the power dissipated on the diodes. With the particular components utilized, \( P_{q} = 220 \mu W \). Moreover, the value of \( P_{d} \) is equal to the forward voltage \( V_f \) of the diodes (for Schottky diodes, \( V_f = 0.25 \) V), multiplied by the current drawn by the tag:

\[
P_{d} = \frac{V_f}{V_{cc}}(P_{ch} + P_{q} + P_{R1}).
\]

During the 555 timer operation, the total capacitance \( C = C_p + C_{RH} \) (see Fig. 3) is charged from \( V_{cc}/3 \) to \( 2V_{cc}/3 \)

\(^{2}\) All equations have been experimentally verified, with the experimental results deviating from the corresponding theoretical values by \( \pm5 \mu W \).
in \((R_1 + R_2)C \ln(2)\) seconds. Considering that a first-order \(RC\) circuit is formed by \(R_1\), \(R_2\) and \(C\), the voltage \(V_c(t)\) which is developed across \(C\) and the current \(I(t)\), drawn by the power supply, are given by:

\[
V_c(t) = V_{cc}(1 - e^{-\frac{t}{R_1C}}) + V_c(0) e^{-\frac{t}{R_1C}},
\]

\[
I(t) = \frac{V_{cc} - V_c(t)}{R_1 + R_2},
\]

where \(V_c(0) = V_{cc}/3\) is the initial condition of the capacitor voltage. Thus, using (9) and (10), the average power \(P_{ch}\) drawn by the power source, \(V_{cc}\), during a period of \(1/F\), is calculated as follows:

\[
P_{ch} = F \int_0^{(R_1+R_2)C \ln(2)} V_{cc} I(t) \, dt
\]

\[
= \frac{V_{cc}^2}{3(R_1 + 2R_2) \ln(2)}.
\]

As stated above, current flows through \(R_1\) while timer output is “low”, discharge pin is grounded (and the RF transistor is “on”) and thus, the average power drawn by \(R_1\) is given by:

\[
P_{R_1} = \frac{(1 - D)V_{cc}^2}{R_1} + \frac{2V_{cc}^2}{R_1^2/R_2 + 2R_1}.
\]

Power consumed during discharge is the dominant power consumption factor. As an example, a typical tag with \(R_1 = 5.3\, \text{k}\Omega\), \(R_2 = 10.6\, \text{k}\Omega\) and \(C = 730\, \text{pF}\) operating at \(F_{sw} = 74.5\, \text{kHz}\) consumes \(P_{ch} = 92\, \mu\text{W}\), \(P_d = 77\, \mu\text{W}\) and \(P_{R_1} = 385\, \mu\text{W}\), resulting in \(P_{tot} = 775\, \mu\text{W}\). Such a low power consumption results in the minimization of the power-source capacity requirements, thus further reducing the installation cost of the proposed WSN. Increasing \(R_1\) reduces \(P_{R_1}\) but such an approach would also degrade the communication performance, as described in the following paragraph.

The implemented receiver is dependent on the power of the fundamental subcarrier frequency of the backscattered signal, which is given by [36]:

\[
P(a_1) = \left[ \frac{A\sqrt{2}}{\pi} \sin(\pi D) \right]^2,
\]

where \(D\) is the duty cycle and \(A\) is the peak-to-peak amplitude of the pulse signal. For \(D = 50\, \%\), the value of \(P(a_1)\) is maximized; when \(D\) is higher (or lower) than \(50\, \%\), the power of the fundamental frequency is decreased.

For example, considering the case of two tags with the same subcarrier frequency of 50 kHz, where one tag has \(D = 60\, \%\) and the other has \(D = 75\, \%\), then the total power consumption and power of their fundamental frequencies are calculated using (1), (2) and (15). The corresponding results are presented in Table I. It is observed that the sensor/tag with \(D = 60\, \%\) consumes approximately 2 times more power than the one with \(D = 75\, \%\), but the latter lacks power in its fundamental frequency by a factor of 1.81, which in turn will result in less accurate reception, as explained in the following section.

### Table I: Example of two tags with different duty cycle \(D\).

<table>
<thead>
<tr>
<th>(R_1(\text{k}\Omega))</th>
<th>(R_2(\text{k}\Omega))</th>
<th>(D(%))</th>
<th>(P_{ch}(\mu\text{W}))</th>
<th>(P(a_1))</th>
</tr>
</thead>
<tbody>
<tr>
<td>3.95</td>
<td>8.6</td>
<td>60</td>
<td>989</td>
<td>((1.81A^2)/\pi^2)</td>
</tr>
<tr>
<td>10.35</td>
<td>5.4</td>
<td>75</td>
<td>545</td>
<td>(A^2/\pi^2)</td>
</tr>
</tbody>
</table>

### Fig. 11: Sensor’s subcarrier frequency value is estimated using periodogram detection. After a set of data is collected, the aforementioned filtering is applied.

### Fig. 12: Histogram filtering: A set of measurements is collected and their histogram is calculated. Only measurements within a certain range and with the highest occurrence are kept.

For the implementation of the receiver, a commodity software-defined homodyne radio platform has been utilized, connected to a host PC. As shown in Fig. 11, the received baseband in-phase (I) and quadrature (Q) digitized signal samples are processed using suitable software running in the host PC. The difference in carrier frequency between the
The window containing the bins, that correspond across the histogram and calculating the in-window sample cardinality. The frequency component with the maximum power for each spectrum band is estimated as the corresponding sensor’s subcarrier center frequency at the reader and the emitter (i.e. Carrier Frequency Offset, CFO) results in a variance between the real value and the estimated values of the subcarrier signals. In order to compensate this frequency shift, the difference between the nominal carrier value and the estimated one is calculated after the samples are collected, and then, all samples are frequency-shifted accordingly.

Subsequently, the periodogram of the received signal is calculated and the fundamental subcarrier frequency of the \( i \)-th tag is calculated as follows [33]:

\[
\hat{F}_i = \arg \max_{F \in [F_{L,i}, F_{H,i}]} |X(F)|^2,
\]

where \( X(F) \) is the Fourier transform of the received signal and \( F_{L,i}, F_{H,i} \) denote the lowest and highest possible frequency output of the \( i \)-th tag, respectively, which are a-priori known. Thus, the frequency component with the maximum power for each spectrum band is estimated as the corresponding sensor’s output frequency.

In order to reduce the error introduced from the wireless channel and the thermal noise at the receiver, a two-phase filtering process is implemented. Specifically, all \( \hat{F}_i \)'s are estimated over a period of 10 minutes and stored in an accumulator, thus, producing vector \( \hat{F}_i \). The first phase of the filtering process, considers that the changes of the environmental humidity during that time interval are negligible. Then, a histogram with 200 frequency bins is calculated (corresponding to a frequency resolution of 10 Hz for a sensor’s bandwidth of 2 kHz). The true value is located at the most prominent bins in the histogram (most frequent values), while the noisy outliers are less frequent. An example of such a histogram is depicted in Fig. 12. In order to take advantage of this fact, the \( F_i \)'s that belong to a certain range are kept intact and their mean value \( \mu \) is calculated. The samples outside this range are set to \( F_i = \mu \). The frequency range is determined by sliding a window of length \( = N_{IB} \) bins across the histogram and calculating the in-window sample cardinality. The window containing the bins, that correspond to the most frequent samples is used to calculate the frequency range that is utilized for the filtering.

The second phase utilizes a Savitzky-Golay filtering process [37], which is largely adopted in data smoothing applications [38]. This type of filtering exploits least-squares data smoothing on each subset of the measurement dataset. The critical parameters for this process are the order of the polynomial and the number of samples that the fitting operation is applied to. Thorough experimentation with real data demonstrated that the appropriate polynomial order and subset size are 3 and 201, respectively.

The two-phase process described above results in a significantly reduced error; in some cases, more than an order of magnitude reduction, in terms of the resulting mean error. The performance of each phase of the filtering process is illustrated in Fig. 13. Extensive real-dataset results before and after the filtering application are given in Section IV.

IV. NUMERICAL & EXPERIMENTAL RESULTS

A. Communication Range and Experimental Results

In order to investigate the performance of the proposed WSN in terms of sensing accuracy and maximum communication range, various experiments were conducted. A Silabs Si1004 development kit was utilized as a carrier emitter at UHF (specifically at 868 MHz), with a transmission power of 20 mW (the maximum permissible limit, which is imposed by European directives is 3.2 W) and a commodity SDR reader (Ettus USRP N200) was utilized as the software-defined receiver. The carrier emitter, the receiver and a sensor/tag with subcarrier center frequency at 75 kHz were installed on poles of 1.7 m height. Communication performance was tested for various installation topologies by simultaneously comparing the estimated sensor’s subcarrier frequency at the reader and the output frequency on the sensor/tag, using a frequency data-logger. The corresponding results are presented in Table II, where each row contains the emitter-to-tag distance \( (d_{et}) \), tag-to-reader distance \( (d_{tr}) \), the receiving window duration per
TABLE II: Communication Distances and Accuracy

<table>
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<tr>
<th>#</th>
<th>(d_{s1}(m))</th>
<th>(d_{t1}(m))</th>
<th>Sampling Window(m)</th>
<th>MSE((Hz^2)) pre-filt.</th>
<th>MSE((Hz^2)) post-filt.</th>
<th>RMSE((Hz)) pre-filt.</th>
<th>RMSE((Hz)) post-filt.</th>
<th>MRE(%) pre-filt.</th>
<th>MRE(%) post-filt.</th>
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<td>2</td>
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<td>100</td>
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<td>126.35</td>
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<td>261.82</td>
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<td>5.54</td>
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<td>8.07</td>
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<td>100</td>
<td>6526.23</td>
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<td>6.86</td>
<td>0.55</td>
<td>0.30</td>
</tr>
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<td>40</td>
<td>1000</td>
<td>10.32</td>
<td>17.28</td>
<td>3.21</td>
<td>4.16</td>
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<td>0.19</td>
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<tr>
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<td>96</td>
<td>40</td>
<td>100</td>
<td>20.68</td>
<td>15.34</td>
<td>4.55</td>
<td>3.61</td>
<td>0.08</td>
<td>0.15</td>
</tr>
<tr>
<td>22</td>
<td>96</td>
<td>40</td>
<td>25</td>
<td>17774.15</td>
<td>2484.94</td>
<td>421.60</td>
<td>49.85</td>
<td>7.31</td>
<td>2.25</td>
</tr>
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</table>

![Experimental network topology and communication distances](image)

Fig. 14: Left: Experimental network topology. 10 %RH sensors, 1 plant voltage sensor and 2 carrier emitters with transmit power at 20 mW were deployed. Right: Photo of the deployment inside the greenhouse.

The metrics employed to evaluate the accuracy performance of the proposed WSN are the mean square error (MSE), the root mean squared error (RMSE) and the mean relative error (MRE). The relative error is calculated by dividing the mean absolute error in Hz with the bandwidth of the tag (in this case 2 kHz) and multiplying the result by 100, thus, providing an estimate of the corresponding relative humidity (%RH) error.

For each experiment, both pre-filtering and post-filtering results are reported. It is observed that for the highlighted experiments 6, 10, 13, 18, the MRE is greatly reduced (by one order of magnitude in most cases). For example, in the case of experiment 13, the MRE of 14.72 % indicates that the sensor in this particular setup would be unusable without data filtering. However, after the specific filtering was applied, the MRE was reduced to 3.54 %, offering sensor results in that topology which are useable for the target environmental monitoring application. Therefore, the proposed filtering process, effectively yields higher signal-to-noise ratio (SNR) and longer communication distances.

Nevertheless, the designed filter is not indispensable in high-SNR communication links. For example, filtering in experiments 5 and 20 of Table II apparently increased the
measurement error. That was due to the fact that in the particular high-SNR experiments, only a small number of frequency estimations were erroneous and the filtering process treated more samples than needed as erroneous. However, the error increase was still too small (on the order of 0.1%) to be important, due to the high received SNR.

Finally, it is remarked that end-to-end measurement accuracy depends on both the sensing error (related to the sensing capacitor and conversion from capacitance to frequency through the 555 timer), as well as the reception error (related to the noise and sensitivity of the SDR reader). The first type of error was discussed in Figs. 9 and 10 of Section II.C, while the second type of error is described through Table II above. For example, case 8 of Table II offers an RMSE of 4 Hz (after filtering) in measuring subcarrier frequency at the SDR receiver (due to receiver noise), for a sensor bandwidth of 2 kHz. That corresponds to $100 \cdot 4/2000 = 0.2\%$ RH RMS error. However, sensing and conversion of capacitance-to-frequency offers an RMS error of 2.5 %RH (as discussed in II.C). Thus, in this particular scenario, the end-to-end RMS error is dominated by the sensing error. For other cases of Table II, the end-to-end RMS error can be calculated exploiting independence of the two errors, as follows:

$$\text{RMSE} = \sqrt{\text{RMSE}_1^2 + \text{RMSE}_2^2}, \quad (17)$$

where RMSE$_1$, RMSE$_2$ is the RMS value of the sensing and the reception error, respectively.

B. Experimental WSN in a Greenhouse

Environmental humidity is a critical parameter in greenhouse monitoring, since high relative humidity on plant surfaces promotes the growth of various disease organisms (such as Botrytis cinerea) [24]. Moreover, under saturated humidity conditions plant’s evaporation mechanism deteriorates, resulting in decreased nutrient absorption [25]. In order to evaluate the performance of the proposed environmental monitoring system in a real-world scenario, a sensor network with the aforementioned analog scatter-radio principles was implemented and deployed in a tomato greenhouse at the Mediterranean Agronomic Institute of Chania (MAICh, www.maich.gr).

The WSN consists of 10 environmental relative humidity sensors. In order to increase communication coverage, two carrier emitters with a transmit power of 20 mW each, illuminate the sensors with carrier waves alternatively in time (TDMA). The network topology is depicted in Fig. 14-left, where the locations of the sensors, the emitters, the software-defined receiver and the host laptop computer are indicated. All tags/sensors and emitters were placed in IP65-rated enclosures hanging from the ceiling (Fig. 14-right). All sensors were fabricated with different RC components, based on (5) and (6) in order to implement the FDMA scheme described in Section II. The network’s periodogram is depicted in Fig. 15, where the subcarriers of the individual tags can be observed. The spurious signals are filtered out in the software-defined receiver via the process described in Section III.

The processing of the received backscatter signals was conducted using a low-cost laptop hosting the software-defined receiver. The estimated relative humidity values were uploaded at a remote web database. The data that were collected during more than 48 hours of monitoring are depicted in Fig. 16. Although the sensors exhibit similar behavior, differences in the humidity values, which were recorded by the individual sensors, are also observed. This is due to the different microclimatic environmental conditions which prevail at the installation location of each sensor. For example sensors which are closer to windows measure lower humidity values than ones that are placed closer to the center of the greenhouse, especially during the night.

C. Comparison with classic WSNs

Duty cycling (i.e. periodically transmitting and then falling to idle-mode) is utilized by classic radio WSN nodes in
TABLE III: Comparison of energy consumption per measurement in the proposed and classic WSN radio modules.

<table>
<thead>
<tr>
<th>Comm. Module</th>
<th>Bit-rate (kbps)</th>
<th>Power (mW)</th>
<th>Time “on” (ms)</th>
<th>Energy (mJ/measurement)</th>
</tr>
</thead>
<tbody>
<tr>
<td>CC2500</td>
<td>2.4</td>
<td>42.4</td>
<td>26.7</td>
<td>1.132</td>
</tr>
<tr>
<td>CC2540</td>
<td>10</td>
<td>42.4</td>
<td>6.4</td>
<td>0.271</td>
</tr>
<tr>
<td>CC2540</td>
<td>100</td>
<td>42.4</td>
<td>0.64</td>
<td>0.03</td>
</tr>
<tr>
<td>CC2540</td>
<td>250</td>
<td>42.4</td>
<td>0.256</td>
<td>0.01</td>
</tr>
<tr>
<td>This Work</td>
<td>–</td>
<td>7.2</td>
<td>1000</td>
<td>0.72</td>
</tr>
<tr>
<td>This Work</td>
<td>–</td>
<td>7.2</td>
<td>100</td>
<td>0.072</td>
</tr>
<tr>
<td>This Work</td>
<td>–</td>
<td>7.2</td>
<td>50</td>
<td>0.036</td>
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<tr>
<td>This Work</td>
<td>–</td>
<td>7.2</td>
<td>10</td>
<td>0.007</td>
</tr>
</tbody>
</table>

In order to decrease the energy consumption per measurement, thus extending WSN lifetime. In this work, the sensor tags are designed such that they consume low power; utilization of duty cycling could further decrease the required energy requirements per measurement. Experimentation with various receiving window durations provided an indication about the smallest time period that the sensors should remain in the ‘active’ state in order to scatter the acquired measurement with an acceptable error. However, there is an inherent communication tradeoff: by decreasing duration of the receiving window (and thus, the number of received signal samples at the receiver), signal-to-noise ratio will also be decreased. Therefore, smaller receiving window durations result in degraded communication performance. As demonstrated in Table II, the receiving window duration (i.e. sampling window) can be as small as 10 ms for relatively small $d_{rot}$ distances (experiment 3) and down to 100 ms for longer distances (experiments 8, 12, 17, 19, 21). On the other hand, the sampling window of 1 sec outperforms narrower sampling windows.

The energy consumption per measurement transmission for a classic WSN module, typically consisting of a microcontroller and an active, low-power ZigBee-type radio, is given by:

$$E_{\text{wsn}} = N_b \frac{P_{\text{tx}}}{T_{\text{tx}}}, \quad (18)$$

where $N_b$ is the number of bits per measurement transmission, $F_{\text{tx}}$ is the data rate (in bits per second) and $P_{\text{tx}}$ is the power consumption (in Watts). On the other hand, the energy per measurement for the developed analog humidity sensor with scatter-radio is given by:

$$E_{\text{bs}} = T_{\text{bs}} P_{\text{bs}}, \quad (19)$$

where $T_{\text{bs}}$ is the receiving window duration (in sec) needed for reliable backscattering of humidity measurement and $P_{\text{bs}}$ is the power consumption of the sensor (in Watts). A comparison (in Joules per measurement) between the two approaches is given in Table III. For the classic WSN radio, a packet of 64 bits per measurement was assumed, transmitted at 0 dBm power (as for example in a state-of-the-art low-power WSN radio module). In particular, for the case of a 100 ms receiving window, the analog scatter-radio sensor outperforms the active radio for data rates smaller than 100 kbps. Moreover, for receiving windows of 10 ms, the proposed sensor outperforms the classic WSN radio module, regardless bit-rate. It is important to note that for particular applications such as %RH monitoring inside a greenhouse, accuracy of measurement is not a major issue and even an MRE of 5% is tolerable. Therefore, smaller sampling windows can be utilized safely, regardless of the measurement accuracy degradation, which, however, remains at an acceptable level (e.g. MRE 1.05% for 10 ms).

These results demonstrate the potential of the proposed WSN to achieve reliable transmission of collected measurements, with low cost and low power consumption for short-range environmental monitoring applications on the order of 100 m range.

V. Conclusion

This paper presented the development of a novel WSN for environmental relative humidity monitoring, using analog scatter-radio-enabled sensors that consume less than 1 mW of power and offer communication range above 100 m. The proposed WSN utilized frequency division multiple access that allowed all receiver-less sensors to communicate in a collision-free manner and is ideal for low-bitrate environmental monitoring. The multipoint surface fitting calibration, in conjunction with the two-phase filtering process, provided a mean absolute error of 1.9 %RH for a temperature range of 10-50 °C. Additionally, it was demonstrated that the energy consumption per measurement of the proposed WSNs is lower than that of a ZigBee-type WSN. The proposed WSN is suitable for distributed monitoring of environmental parameters in large-scale, precision agriculture applications. Future work will focus on further decreasing the power consumption of the proposed joint sensor-scatter radio communicator design, by at least one order of magnitude.

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REFERENCES

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John Kimionis (S’10) received his Engineering Diploma and M.Sc. in Electronic and Computer Engineering from Technical University of Crete, Greece, in 2011 and 2013, respectively. At TUC, he was an undergraduate/graduate researcher with the Telecom Lab working on backscatter radio communication for large-scale and low-cost wireless sensor networks. His main focus was in the areas of backscatter radio and RFID, wireless sensor networks, software defined radio for backscatter radio and sensor networks, and telecom modules/communication algorithms development.

In 2013, he joined the School of Electrical and Computer Engineering, Georgia Institute of Technology (Atlanta, GA) as a PhD candidate. He is currently a member of the ATHENA research group, focusing on microwave and RF engineering, and rapid electronics prototyping. His main research interests are the design of low-cost RF front-ends for backscatter radio tags/sensors and fabrication techniques with inkjet printing. Coupling these with his communication background, he aims on significantly extending the range of backscatter radio sensors, while maintaining low power consumption of the tags.

He has received fellowship awards for his undergraduate and graduate studies, and was the recipient of the Second Best Student Paper Award in the IEEE International Conference on RFID-Technologies and Applications (RFID-TA) 2011, Sitges, Barcelona, Spain.

Aggelos Bletsas (S’03-M’05-SM’14) received with excellence his diploma degree in Electrical and Computer Engineering from Aristotle University of Thessaloniki, Greece in 1998, and the S.M. and Ph.D. degrees from Massachusetts Institute of Technology in 2001 and 2005, respectively. He worked at Mitsubishi Electric Research Laboratories (MERL), Cambridge MA, as a Postdoctoral Fellow and at Radiocommunications Laboratory (RCL), Department of Physics, Aristotle University of Thessaloniki, as a Visiting Scientist. He joined School of Electronic and Computer Engineering, Technical University of Crete, in summer of 2009, as an Assistant Professor, and promoted to Associate Professor at the beginning of 2014.

His research interests span the broad area of scalable wireless communication and networking, with emphasis on relay techniques, backscatter communications and RFID, energy harvesting, radio hardware/software implementations for wireless transceivers and low cost sensor networks. His current vision and focus is on single-transistor front-ends and backscatter sensor networks, for LARGE-scale environmental sensing. He is the principal investigator (PI) of project BLASE: Backscatter Sensor Networks for Large-Scale Environmental Sensing, funded from the General Secretariat of Research & Technology Action Proposals evaluated positively from the 3rd European Research Council (ERC) Call. He is also Management Committee (MC) member and National Representative in the European Union COST Action IC1301 Wireless Power Transmission for Sustainable Electronics (WiPE).

He is Associate Editor of IEEE Wireless Communication Letters since its foundation and Technical Program Committee (TPC) member of flagship IEEE conferences. He holds two patents from USPTO and he was recently included in http://www.highlycitedgreekscientists.org/.

Dr. Bletsas was the co-recipient of IEEE Communications Society 2008 Marconi Prize Paper Award in Wireless Communications, best paper distinction in ISWCS 2009, Siena, Italy, and Second Best Student Paper Award in the IEEE RFID-TA 2011, Sitges, Barcelona, Spain. Two of his undergraduate advisees were winners of the 2009-2011 and 2011-2012 best Diploma Thesis contest, respectively, among all Greek Universities on "Advanced Wireless Systems", awarded by IEEE VTS/AESS joint Greek Chapter. At the end of 2013, Dr. Bletsas was awarded the Technical University of Crete 2013 Research Excellence Award.

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Christos Konstantopoulos was born in Athens, Greece, in 1989. He received the B.Sc. degree in 2012 from the School of Electronic and Computer Engineering, Technical University of Crete, Chania, Greece, where he is currently working toward the M.Sc. degree. As undergraduate student he developed a power management system for the maximization of the energy that comes from flexible photovoltaic cells. Currently, as a graduate researcher he works on a microelectronic system for ultra low energy harvesting that is applicable to low power backscatter networks.

His research interests include power electronics for renewable energy sources, energy harvesting for wireless sensor networks, and electronic measurement systems.