

Radar-based Security System: Implementation for Cluttered Environment

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Abstract

We present an experimental implementation of the inexpensive microwave security sensor that can detect both static and slowly moving objects in cluttered environment. The prototype consists of a frequency-modulated continuous wave radar sensor, control board or computer and software. The prototype was tested in a cluttered indoor environment. In case of intrusion or change of environment the sensor will give an alarm, determine the location of new object, change in its location and can detect a slowly moving target. To make a low-cost unit we use commercially available automotive radar and own signal processing techniques for object detection and tracking. The intruder detection is based on a comparison between current 'image' in memory and 'no-intrusion' reference image. The main challenge is to develop a reliable technique for detection of a relatively low-magnitude object signals hidden in multipath clutter echo signals. Various experimental measurements and computations have shown the feasibility and performance of the system.

Key words: radar, security, clutter, Doppler, FMCW

I. Introduction

The use of the security applications increases daily because losses of enterprises due to theft, damage

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reach the high numbers. In majority of applications, security systems are deployed for the protection of people, property or structural health monitoring. Protection of people and areas has been traditionally done with help of the installation of perimeter fencing, cameras, and security personnel watching monitors and walking the perimeter. Optical cameras become less informative in snow, rain, smoke, and fog. The security systems are typically quite expensive and they not always provide the reliable protection considering their performance versus cost value. A radar-based security sensor can give an effective solution to the problems. It has several advantages over traditional one because it can operate 24 hours a day in various environments, different times of day and weather conditions.

The recent radar technology advances have made possible to produce relatively inexpensive frequency-modulated continuous wave (FMCW) radars [1, 2]. They are also popular in pedestrian safety systems [3, 4, 5] with pedestrian recognition capability like in [3]. The FMCW radars have some advantages over traditional pulse Doppler radars [6]. The accuracy of FMCW radar range measurement

is dependent on a frequency sweep bandwidth and number of samples however there are many methods to improve the range accuracy by interpolation.

The one of the major problems in radar sensing is to detect an object in a clutter environment. In various environments clutter echo signals are generated from different multiple sources and can exceed the object reflection signal levels, making the object detection very difficult. In order to address this problem, many different clutter rejection algorithms have been created and tested by various researchers, for example in [7] and [8].

The one-channel FMCW radar unit has its control unit and single antenna, and typically operates in a continuous mode. Any change in the environment of secured area modifies the data of radar output. The intruder detection principle is based on finding of changes between two snapshots: a stored 'no-intrusion' reference (background) snapshot and a current measured one. Using the difference, we can detect a newly appeared object and find its other parameters [9]. If we work with binary signals, the binary distance becomes a measure of difference between signals. There are many algorithms to find the distance as in [10]. There are extra questions how to maximize the differences which are discussed later.

This paper evaluates a microwave (radar-based) security sensor design and performance that can be used for building an inexpensive system. The proposed clutter rejection algorithm is based on experimental measurements in indoor environment.

II. Background

In our previous work [9] we have reported a radar-based surveillance system development, where the radar is based on a frequency modulated continuous wave (FMCW) principle.

For detecting a motion, it is common to use a Doppler radar. However the Doppler radar cannot detect newly appeared static or slowly moving objects. One of the goals of this work is to demonstrate such a method that makes a static or slowly moving target detection possible using proposed algorithm by rejection of clutter signals

and finding a true target signal. As slowly moving object we consider a human intruder. This method can find an extra application in detection of environment changes.

To reduce a cost of proposed security system, we are going to use a mass-production radar, open hardware and free software components for control board. In spite of mass-production origin, the radar is a medium-cost one and will still be a major contributor to the overall cost.

Before we focused on a continuous measurement mode as crucial operating principle, and created the data acquisition and analysis software. This work is the evolution of previous ideas and concept of an inexpensive security sensor. In this paper we investigate the radar-based security sensor design and performance in a cluttered indoor environment relating to object detection and ranging techniques.

The FMCW radar has its control unit and single antenna, and typically operates in a continuous mode. If there is any change in the environment of surveillance area, it modifies a signal profile, and then we compare a memorized 'no-intrusion' signal with a current one. From the difference between the signals, we can detect an object and find its parameters. The goal is to provide such a signal processing method that allows memorizing a state of secure area and then periodically and continuously checking the secure area for intruders by comparing current state with the original reference state.

In [9], the storage of a memorized reference and a current 'image' was proposed using a digital perceptual hash. In contrast with commonly used hash which value is always changed for different input, the perceptual hash is expected to change the hash value only if the input is perceptually changed [11]. The perceptual hash algorithm was shown in [9, 12].

III. Experimental Setup

In our experiments, we use an automotive one-channel K-band FMCW radar front-end with 24 GHz center frequency, 1500 MHz bandwidth and horn-type antenna. A radar security system consists of the following modules: communication (serial



Fig. 1. Test setup

port), measurement, post-processing and visualization (GUI for displaying results). In this work to focus on clutter rejection algorithms, the stationary or slow moving objects are only taken into account.

The experimental setup (Fig. 1) has been made to test the radar performance of object detection within a typical cluttered indoor environment of an office building.

The radar was connected with a PC control unit (laptop) by RS-232 serial interface (Fig. 2). The maximum number of points/samples collected per single measurement was variable and up to 1501.

The object was a rectangular thin metal plate that is placed at distance d . The test environment was a typical office building with long hall having the nominal width: 206 cm). Targets were visible from a radar's point-of-view. The experiment with clutter rejection was repeated many times using the rectangular metal plates from size of 16×19 cm to 59×98 cm at the following distances of 9, 15, 21, 33, 39, 45, 57, and 69 m. The ranges were verified by extra range measuring instruments.

For security applications, we created software with continuous measurement and post-processing flow using both R+Java and C++(Qt) cross-platform application framework to implement the data acquisition and analysis routines. Our experiments require a frequent change of setting up for making many trials, to meet that requirement a new

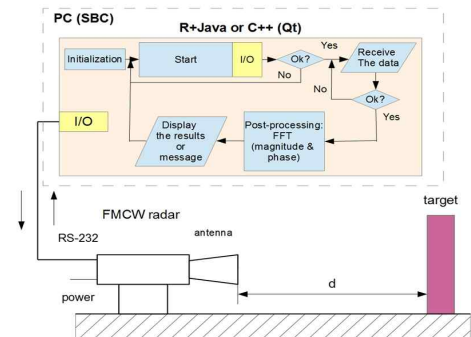


Fig. 2. Measurement setup and block diagram of control module (SBC - single board computer)

interface was developed using high-level programming languages such as R and Java. R script is used as a quick test routine for all algorithms, which, in the case of successful result, then can be ported to C++ for higher execution speed on hardware. The implementation is based on Sweave (R+LaTeX) that is a text file which includes data, codes and description on how the code is applied to the data.

IV. Procedure

We follow our previously developed processing algorithm with more details and some changes for improvements and optimization. There are two working modes of the security system. The first mode is detection with localization of the intruder; the second one is alarm mode where radar output is digitized for convenience and speed of the data processing. We begin with the first mode.

Our procedure of data processing workflow representing one measurement cycle is shown in Fig. 3. The initialization is done using parameters in Table 1.

The data from radar are collected into two arrays: the clutter measurements (no target) are stored into R array in advance; regular data are in T when there is a target. The R and T are same size. The typical data are shown in Fig. 4. After post-processing we save the FFT magnitudes in and arrays R_{mag} and T_{mag} find the difference

Table 1. Radar parameters

Parameter	Value
Center frequency of sweep	24.7GHz
Sweep bandwidth	1.5GHz
Waveform	Sawtooth
Number of frequency points	1501
Frequency step	1MHz
Sampling frequency	20kHz
Nyquist frequency	10000Hz
Frequency resolution	13.32Hz

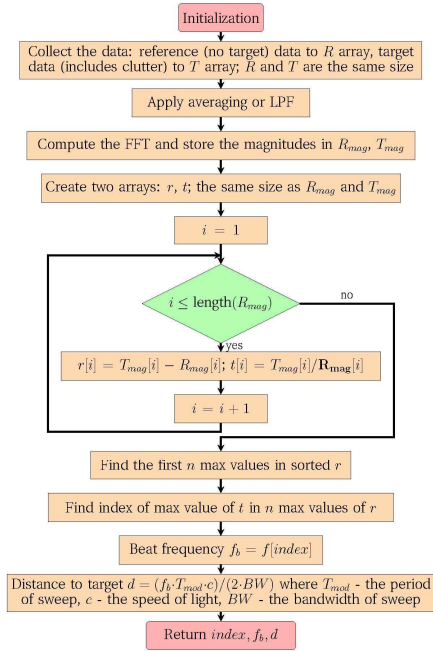


Fig. 3 Flow chart of single measurement cycle

$$r_i = T_{mag} - R_{mag}$$

and the signal to clutter ratio

$$t_t = T_{mag}/R_{mag}$$

for $i = 1, \dots, N$.

Then we find the first n (e.g. $n = 20$) maximum values in r and save their indexes to new array r_{index} to identify the corresponding t values and create new data table (Table 2). For further

calculations we select the *index* element where the t is maximum that is 39.3 dB at 426th index).

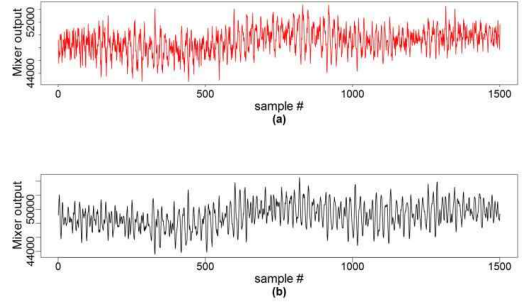


Fig. 4. Radar mixer data output (1501 points): (a) with intruder/target, (b) reference or clutter (no intruder/target)

Table 2. Preselected 20 points with maximums of r

No	indexes of $\max_{20}(D)$	SCR (dB)
1	426	39.3
2	103	10.8
3	85	21.2
4	87	15.4
5	151	13.8
6	425	34.4
7	218	10
8	427	23.8
9	664	20.8
10	659	12.6
11	96	11.6
12	716	20.3
13	246	17.2
14	217	22.3
15	228	10.5
16	660	9.3
17	72	18.9
18	719	25.3
19	168	12.4
20	658	16.7

Next step is to determine a beat frequency as $fb = f[index]$ and calculate the distance to the target(s):

$$d = f_b \cdot T_{mod} \frac{c}{2 \cdot BW},$$

where T_{mod} - the period of sweep in s , c - the speed of light in m/s , BW - the bandwidth of

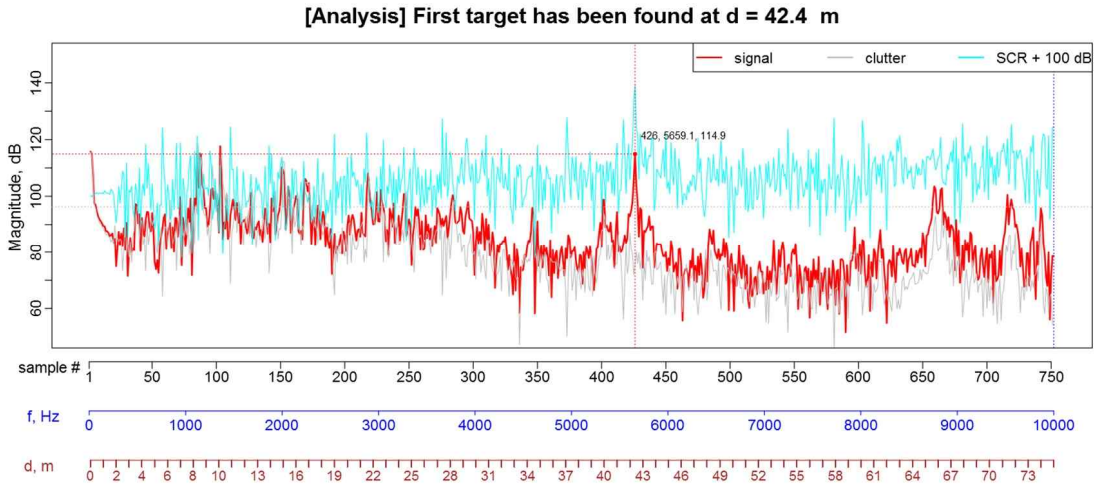


Fig. 5. The object detection and localization example at range of 42.4 m

sweep in Hz.

As seen above, the feature of our method is to create a list of the first n of r maximums, and then find the target using the t maximum value.

V. Analysis

The distance to different objects in FMCW radar measurements is traditionally extracted using a Fourier Transform of the sampled signals.

The challenge of an indoor radar operation is the detection of a target in a cluttered indoor environment where multiple reflections from the clutter may exceed the level of target reflections. In this context the clutter rejection technique becomes the most essential part of the data acquisition and analysis module.

If any intruder crosses the virtual fence or radar beam, it changes the signal profile, then if we compare a memorized 'no-intrusion' signal with a current one, we can find a difference and give an alarm, the location of a target and its relative speed.

In order to display all required information, a new plot layout template was created to combine the plots (Fig. 5). The plot displays an object detection and localization analysis.

Figure 5 shows one of the object detection experiments with the fixed radar and the object

placed at $d \approx 42.4$ m. The collected data include two measurements, where the clutter measurement representing a reference signal was made without the target. The plot is customized and has 3 x-axes, where each one with own unit of measurement: sample number - all samples are collected at the equal time intervals, beat frequency f in Hz, distance d to the target in meters. The dashed line represents a signal to clutter ratio (SCR) in dB shown to be plus 100 dB to an actual value to display it for comparison.

Let us consider the second mode of operation - alarm mode. For digitizing the radar signals we use the cubic spline approximation in whole sample. The hash bits are set to 0 or 1 depending on whether each of the FFT magnitude values is above or below the approximation value (Fig. 6). The result will not vary as long as the overall structure of the radar data remains the same.

In Fig. 7, plot (a) is average of several snapshots when no intruder (object) is presented. Plot (b) is a radar output with an existing intruder - the movable target - a vertical metal plate that imitates the intruder is located at $d = 16$ cm from the radar, Fig. 1. Plot (c) is the reference signal, a sample number or frequency versus magnitude curve after FFT analysis.

The perceptual hash values can be compared using the Hamming distance (dH) algorithm which is one

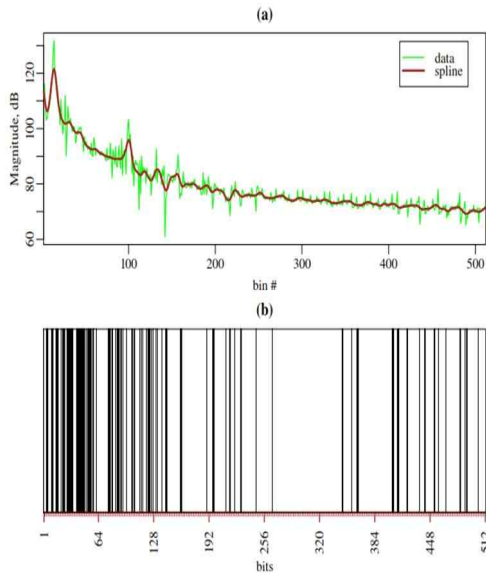


Fig. 6. Digitizing the radar signal

of the most popular methods, comparing each bit position and counting the number of differences. To detect an intrusion, various binary distance algorithms are used. The intrusion influenced signal should have a bigger distance value between the signal and the reference signal. The distance is also dependent on what algorithm is in use for averaging or approximation to find the hash bits.

After constructing the hash e.g. 512-bit integer, the binary view of hashes for all 3 snapshots is shown in Fig. 7d (the white bit is 0, the black bit is 1). The heatmap function of R stats package was used for the visualization of a 'binary' signal output. The binary distances for two non-reference signals are:

Table 3. Comparison of binary distances algorithms

Between snapshots:		(a) & (c)	(b) & (c)	Diff., %
Distances	Hamming	230	266	13.53
	Jaccard	0.76	0.84	9.52
	Hellinger	1.47	1.63	9.81
	AreaRatioDiff	3.91	4.78	18.2

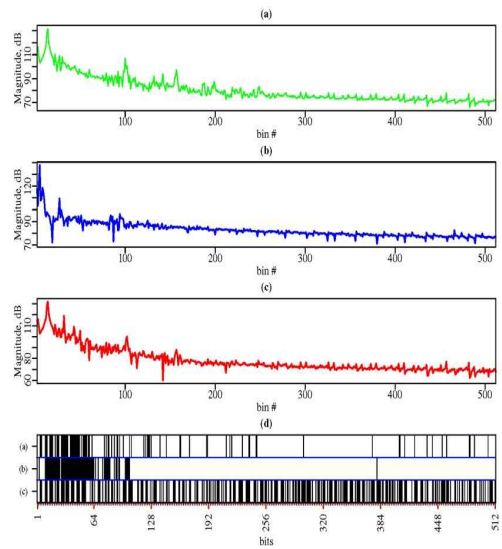


Fig. 7. FFT analysis of 3 radar snapshots for 512 points, where (a) - average of several signals without intrusion, (b) - signal with intruder and (c) - reference signal

In this example the hash bits are generated using cubic spline approximation of the reference data. In addition to well-known algorithms for binary distances we add our own which is called as 'AreaRatioDiff' (d_{wbd}) - the difference of 0-to-1 bit ratios. The main idea behind the algorithm is as follows:

$$d_{wbd} = \left(\frac{count(0bit)}{count(1bit)} \right)_{cur} - \left(\frac{count(0bit)}{count(1bit)} \right)_{ref}$$

where $()_{cur}$ is current snapshot and $()_{ref}$ is the reference.

If we look at Hamming distance that is calculated between (b) and (c) snapshots it gives higher value indicating the intruder according to the condition of our test. Setting the range for allowable values, one can specify the sensitivity for the system using an upper threshold level, e.g. the tolerable (no-intrusion) range of dH values which are dependent on algorithm of binary distance calculation. However, using our data the

'AreaRatioDiff' gives the biggest difference comparing to other algorithms (Table 3).

By setting the range of the system sensitivity, an alarm can be properly produced.

VI. Conclusion

In our experimental measurements the radar demonstrates an expected performance according to the specification. Target detection within an indoor environment is challenging due to the presence of multipath echoes from various objects, and requires a highly-efficient clutter rejection processing. We successfully tested our relatively simple clutter rejection algorithm with some known various targets. However, it is evident that more tests with various size targets are required. Several tests with smaller sized plates placed near floor level have shown some instability in the results.

Digitizing radar signals by perceptual hash can help storing the radar images in a compact form that is easy to retrieve and process.

There is a need to improve the data transfer rate of serial interface using new hardware.

In spite of various complexities and difficulties, our experimental measurements confirm the validity of applied techniques and feasibility of effective security operations.

For further developments, various enhancements of the developed algorithms and improvements of system performance are required. In the future experiments the moving targets will be investigated.

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