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A novel multiple objective fitness function for DSA transmission parameter optimization

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KEYWORDS Dynamic spectrum access; Cognitive engine; Objective fitness function; Transmission parameter optimization; Genetic algorithm. **Abstract.** A novel multiple Objective Fitness Function (OFF) is proposed for transmission parameter optimization in dynamic spectrum access. The proposed scheme consists of two phases: In the first phase, four OFFs are individually designed, where the spectrum band index is additionally considered unlike the conventional OFFs. In the second phase, then, the individual OFFs are combined to form a multiple OFF, where the individual OFFs may be differently stressed depending on the transmission scenario of interest. In simulation results, finally, the proposed multiple OFF is found to provide the optimal parameter set for transmission under various types of scenarios.

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1. Introduction

As higher date-rate wireless applications have developed rapidly, nowadays, efficient use of the limited frequency spectrum has become more critical [1], and the Dynamic Spectrum Access (DSA) is considered as a solution to the spectrum scarcity problem [2], where frequency bands, that are not used as much as they could be, may be used for Secondary Users (SU), i.e. unlicensed users [3]. To utilize the underused bands, an SU detects whether or not the underused spectrum band is occupied by the Primary User (PU), and subsequently, if the band is not being used, the SU utilizes the band with the transmission parameters being optimized through a special structure called cognitive engine [4].

Considering that the channel status on each spec-

trum band could be different, it would be better for the SU if we could select a spectrum band with the best channel status out of the vacant spectrum bands. So, in this paper, we consider a transmission parameter optimization taking the spectrum band selection into account, unlike the conventional optimization methods [5-8], and develop the associated multiple Objective Fitness Function (OFF) to be incorporated in a cognitive engine. We consider a cognitive engine based on the Genetic Algorithm (GA) in this paper.

Although the development of the multiple OFF was investigated preliminarily in [9,10]. Chae et al. [9,10] do not provide details of each individual OFF design and the multiple OFF development, and moreover, due to the limitations, both, in the range of the spectrum band measured in a real environment and in the diversity of the transmission parameter set and scenario used in simulation, the results presented in [9,10] are not enough to validate the performance and the applicability to real environments of the multiple OFF. In this paper, we provide a detailed discussion

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of the four individual OFFs and the multiple OFF, and present extensive numerical results, validating the use of the proposed multiple OFF in real environments.

The remainder of this paper will proceed as follows. Section 2 introduces the cognitive engine with its OFF, and Section 3 first designs four individual OFFs including the spectrum band selection as a parameter, and then, develops a multiple OFF. Section 4 shows that the proposed multiple OFF performs well for parameter optimization under various types of transmission scenarios via numerical results, and finally, Section 5 concludes this paper.

2. System model

Assuming that environment parameters such as noise density are given, we can depict the overall process of the DSA incorporating the transmission parameter optimization as shown in Figure 1. Conventionally, the following three transmission parameters are considered in the optimization process: The SU transmit power, the modulation index, and the SU signal bandwidth. However, it should be noted that the transmission channel status also strongly depends on the spectrum band, and thus, in this paper, we include the spectrum band index as a new transmission parameter to be optimized and denote the four parameters by P_s , M, B_s , and k, respectively.

In a cognitive engine based on the GA, each candidate of the transmission parameters is represented by multiple bits on a chromosome structure depicted in Figure 2. In this paper, we consider a chromosome



Figure 1. Transmission parameter optimization in DSA systems.



Figure 2. An example of a chromosome structure representing the transmission parameters.

structure with a length of ten bits to represent the four transmission parameters: The first four bits are assigned for P_s , and the three two-bit strings of the following six bits are assigned for M, B_s , and k, respectively, i.e. we consider $16(2^4)$, $4(2^2)$, $4(2^2)$, and $4(2^2)$ candidates of P_s , M, B_s , and k, respectively.

Denoting the individual OFFs corresponding to the four transmission parameters by $\{f_l\}_{l=1}^4$ each and the weight values of the individual OFFs by $\{w_l\}_{l=1}^4$ each, we can represent the multiple OFF f as:

$$f = \sum_{l=1}^{4} w_l f_l,\tag{1}$$

i.e. as a weighted sum of the individual OFFs, where $0 \leq \{f_l\}_{l=1}^4 \leq 1$ and $\sum_1^4 w_l = 1$. Each individual OFF represents a performance measure associated with each transmission parameter, and the weight values reflect the priority among the performance measures for a given transmission scenario, e.g. the throughput measure would be more weighted for multimedia data transmission, and on the other hand, high reliability transmission would give more weight to the error rate measure.

3. Proposed OFFs

In the first part of this section, we present four performance measures associated with the four transmission parameters, and design four individual OFFs for the four performance measures. Next, in the second part, the designed individual OFFs are combined to form a multiple OFF, and the overall optimization process incorporating the multiple OFF is described.

3.1. Four individual OFFs

3.1.1. Individual OFF for SU transmit power

The Bit Error Rate (BER) is one of the best performance measures for the SU transmit power, since the BER is strongly related to the signal transmit power for a given background noise density. Specifically, the BER, denoted by P_b , can be represented as:

$$P_b = \frac{2P_s}{B_s \times \log_2(M) \times N_0},\tag{2}$$

where N_0 is the noise density. Then, considering that the OFF value is between 0 and 1, we design the individual OFF f_1 as:

$$f_1 = \frac{\log_{10}(0.5) - \log_{10}(P_b)}{\log_{10}(0.5) - \log_{10}(P_b^{\min})},\tag{3}$$

for the SU transmit power, where P_b^{\min} represents the minimum value of P_b .

From Eq. (3), it is easily observed that f_1 achieves the maximum and minimum values, i.e. 1 and 0, when $P_b = P_b^{\min}$ and 0.5 (the worst case value), respectively.

3.1.2. Individual OFF for modulation index

It is well known that a higher modulation index yields a higher throughput, and thus, it is natural to choose the throughput as a performance measure associated with the modulation index. Denoting the maximum and minimum modulation indices given in a transmission scenario by $M_{\rm max}$ and $M_{\rm min}$, respectively, we design the individual OFF f_2 as:

$$f_2 = \frac{\log_2(M) - \log_2(M_{\min})}{\log_2(M_{\max}) - \log_2(M_{\min})},\tag{4}$$

for the modulation index, where we can see that the maximum and minimum values of the individual OFF are obtained when $M = M_{\text{max}}$ and M_{min} , respectively.

3.1.3. Individual OFF for SU signal bandwidth

As the SU bandwidth becomes wider, the SU system performs better; however, at the same time, the SU interference to the PU increases. Since the SU is an unlicensed user, the interference to the PU caused by the SU bandwidth should be strictly controlled. Considering that the SU transmit power as well as the SU signal bandwidth has a large influence on the interference, we design the individual OFF f_3 as:

$$f_3 = 1 - a \left(\frac{P_s - P_s^{\min}}{P_s^{\max} - P_s^{\min}}\right) - b \left(\frac{B_s - B_s^{\min}}{W(k) - B_s^{\min}}\right),$$
(5)

for the SU bandwidth, where the positive numbers a and b add up to one and reflect the relative influences of the SU transmit power and bandwidth, respectively, on the interference to the PU; P_s^{\max} and P_s^{\min} represent the maximum and minimum values of P_s , respectively, W(k) is the kth PU spectrum bandwidth, and B_s^{\min} is the minimum value of B_s and is less than or equal to W(k).

3.1.4. Individual OFF for spectrum band index

Prior to the transmission parameter optimization, a detection process, called the spectrum sensing, is performed to find vacant spectrum bands among spectrum bands assigned to the PU. The spectrum sensing often provides more than two spectrum bands as vacant ones, and thus, it would be useful if we could choose one with the best channel status among the provided vacant spectrum bands. In this paper, we define the best vacant spectrum band as one with the highest vacancy probability and the largest bandwidth among the vacant spectrum bands detected by the spectrum sensing.

Since the spectrum sensing is a detection process based on a comparison between a test statistic and a threshold for a given spectrum band, as the difference between the test statistic and threshold becomes larger, the detection probability increases and the vacancy probability, in which the associated spectrum band is vacant, also increases. Considering that all of the terms in an individual OFF have values between 0 and 1, thus, we design the term:

$$\left(\frac{D(k) - D^{\min}}{D^{\max} - D^{\min}}\right),\tag{6}$$

to take the vacancy probability into account in selecting the best vacant spectrum band, where $D(k) = T(k) - \gamma(k)$ with T(k) a test statistic and $\gamma(k)$ a threshold of the kth spectrum band, and D^{\max} and D^{\min} represent the maximum and minimum values of D(k), respectively. Similarly, denoting the maximum and minimum values of the kth spectrum bandwidth W(k) by W^{\max} and W^{\min} , respectively, we design the term:

$$\left(\frac{W(k) - W^{\min}}{W^{\max} - W^{\min}}\right),\tag{7}$$

which becomes 1 and 0 when $W(k) = W^{\max}$ and W^{\min} , respectively.

In addition, we consider the suitability of the SU signal bandwidth to the vacant spectrum bands, i.e. the vacant spectrum bandwidth would be efficiently used if we could choose a vacant spectrum band with a bandwidth similar to the SU signal bandwidth. Thus, adding the term:

$$\left(\frac{B_s - B_s^{\min}}{W(k) - B_s^{\min}}\right),\tag{8}$$

where B_s^{\min} is the minimum value of the SU signal bandwidth B_s , and combining Formulae (6) to (8), we obtain the individual OFF f_4 as:

$$f_{4} = x \left(\frac{D(k) - D^{\min}}{D^{\max} - D^{\min}} \right) + y \left(\frac{W(k) - W^{\min}}{W^{\max} - W^{\min}} \right) + z \left(\frac{B_{s} - B_{s}^{\min}}{W(k) - B_{s}^{\min}} \right),$$
(9)

where the positive numbers x, y and z add up to one and reflect the relative contributions of the vacancy probability, the PU bandwidth, and the SU bandwidth, respectively, on the selection of the best vacant spectrum band.

3.2. Multiple OFF

From Eqs. (1), (3), (4), (5) and (9), we can depict the overall transmission parameter optimization process incorporating the proposed multiple OFF as shown in Figure 3, where the environment parameters are provided by the spectrum sensing process, and the GA continues to evaluate the multiple OFF with the candidate values of the transmission parameters until it obtains the optimum transmission parameters maximizing the multiple OFF.



Figure 3. The overall process of the proposed transmission parameter optimization method.

As mentioned earlier, the weight values of the multiple OFF depend on given transmission scenarios: For example, since the BER and throughput are the most important performance measures for high reliability transmission and multimedia data transmission, respectively, w_1 and w_2 would be larger than the others for the former and latter transmission, respectively. In the next section, we demonstrate the optimization results for various transmission scenarios to validate the performance of the proposed multiple OFF.

4. Simulation results and discussion

For simulations, we developed a cognitive engine incorporating the proposed multiple OFF based on the MATLAB graphic user interface programming; a screen shot of its control panel is shown in Figure 4, where we can input weights of the multiple OFF and candidate values of the transmission parameters. To validate the performance of the proposed multiple OFF in real environments, we use the spectrum bands of [250 MHz, 260 MHz] and [210 MHz, 220 MHz]

Cognitive Engine Simulator					
Power	Setup (dBm)	Result			
Max:	23	Load the measured spectrum C:\Documents and Settings Open File			
Min:	1.4375	Transmit power (dBm):			
Level:	16	15.8125 Modulation index:			
Modul	ation Index Setup	4			
Max:	16	Bandwidth of selected band (Hz): 3.08696e+006			
Min:	2	Starting point of selected band (Hz): 2.525e+008			
ineight octup		End point of selected band (Hz):			
Band:	1 Throughput: 0	2.556e+008	2.556e+008		
BER:	0 Interference: 0	Bandwidth of the SU signal (Hz): 3.08696e+006			

Figure 4. The cognitive engine simulator.



Figure 5. The frequency spectrum of [250 MHz, 260 MHz] bands.



Figure 6. The frequency spectrum of [210 MHz, 220 MHz] bands.

measured in urban areas which are shown in Figures 5 and 6, where Band 1 \sim Band 4 represent vacant spectrum bands detected by the spectrum sensing.

Table 1 shows the candidate values of the four transmission parameters $(P_s, M, B_s, \text{and } k)$ and the bit representation of each candidate value. The noise density N_0 is obtained from the spectrum band with the lowest power density between 250 MHz and 260 MHz; the spectrum sensing uses an energy detector [11] with a threshold determined with the false alarm probability of 0.01. For the multiple OFF, a and b are set to $\frac{1}{2}$ in f_3 , and x, y, and z are set to $\frac{1}{3}$ in f_4 .

4.1. Verification of the individual OFFs

To verify the performance of the four individual OFFs, in this section, we use the following unit vectors: $\bar{w} = [w_1, w_2, w_3, w_4] = [1, 0, 0, 0], [0, 1, 0, 0], [0, 0, 1, 0],$ and [0, 0, 0, 1] with which the multiple OFF reduces to f_1, f_2, f_3 , and f_4 , respectively.

			1	
Transmission		Value	es (bits)	
parameter		, ara		
	$\frac{23}{16}(0000)$	$\frac{2 \times 23}{16}(0001)$	$\frac{3 \times 23}{16}(0010)$	$\frac{4 \times 23}{16}(0011)$
P_{-} (dBm)	$\frac{5 \times 23}{16} (0100)$	$\frac{6 \times 23}{16}(0101)$	$\frac{7 \times 23}{16}(0110)$	$\frac{8 \times 23}{16}(0111)$
rs (abiii)	$\frac{9 \times 23}{16} (1000)$	$\frac{10 \times 23}{16} (1001)$	$\tfrac{11\times23}{16}(1010)$	$\tfrac{12\times23}{16}(1011)$
	$\frac{13 \times 23}{16} (1100)$	$\frac{14 \times 23}{16} (1101)$	$\frac{15 \times 23}{16} (1110)$	$\frac{16 \times 23}{16} (1111)$
M	2, BPSK (00)	$4,\mathrm{QPSK}\;(01)$	8, 8 PSK (10)	16, 16QAM (11)
Bs	10 kHz (00)	$\frac{W(k)}{4}$ kHz (01)	$\frac{W(k)}{2}$ kHz (10)	W(k) Hz (11)
k	Band $1(00)$	Band $2(01)$	Band 3 (10)	Band 4 (11)

Table 1. Candidates of transmission parameters.



Figure 7. Fitness values and optimized sets when: (a) $\bar{w} = [1, 0, 0, 0]$, (b) $\bar{w} = [0, 1, 0, 0]$, (c) $\bar{w} = [0, 0, 1, 0]$ and (d) $\bar{w} = [0, 0, 0, 1]$ in the spectrum band of [250 MHz, 260 MHz].

Figures 7 and 8 show the fitness value of each individual OFF and the optimized set when $\bar{w} = [1, 0, 0, 0]$, $\bar{w} = [0, 1, 0, 0]$, $\bar{w} = [0, 0, 1, 0]$, and $\bar{w} = [0, 0, 0, 1]$ in the spectrum bands of [250 MHz, 260 MHz] and [210 MHz, 220 MHz], respectively.

From Figuers 7(a) and 8(a), it is seen that the individual OFF f_1 converges to one, yielding an optimized parameter set; it is observed that the 1st4th bits of the chromosome are '1111', the 5th and 6th bits are '00', and the 7th and 8th bits are '00', which means that the SU signal is transmitted with the highest transmit power, the lowest modulation index, and the narrowest bandwidth. Yet, the SU spectrum band is randomly selected since the individual OFF f_1 is not a function of k.

From Figures 7(b) and 8(b), we can observe that



Figure 8. Fitness values and optimized sets when: (a) $\bar{w} = [1, 0, 0, 0]$, (b) $\bar{w} = [0, 1, 0, 0]$, (c) $\bar{w} = [0, 0, 1, 0]$, and (d) $\bar{w} = [0, 0, 0, 1]$ in the spectrum range of [210 MHz, 220 MHz].

the 5th and 6th bits are '11', which means that the highest modulation index is selected. However, the individual OFF f_2 is not a function of the other parameters, and thus, the 1st-4th bits and 7th-10th bits are randomly selected by the GA.

From Figures 7(c) and 8(c), we can observe that the 1st-4th bits are '0000' and the 7th and 8th bits are '00', which allow the SU signal to have the lowest power and the narrowest bandwidth, and thus, the interference to the PU is minimized (i.e., f_3 is maximized).

From Figures 7(d) and 8(d), we can observe that the 9th and 10th bits are '01' in Figure 7(d) and '11' in Figure 8(d). Thus, Band 2 in the spectrum band of [250 MHz, 260 MHz] and Band 4 in the spectrum band of [210 MHz, 220 MHz] are chosen, which are the largest ones in each spectrum band. In addition, it is seen that the 7th and 8th bits of the chromosome are '11' both in Figures 7(d) and 8(d), which means that the SU uses the whole spectrum of the largest band. On the other hand, for the transmit power (the 1st-4th bits) and the modulation index (the 5th and 6th bits), the corresponding bit values are randomly selected since the individual OFF f_4 is not a function of P_s and M.

4.2. Transmission parameter optimization with the multiple OFF

Figures 9 and 10 show the parameter optimization results for various transmission scenarios including the multimedia service mode, high reliability service mode, and low PU interference service mode in the spectrum bands of [250 MHz, 260 MHz] and [210 MHz, 220 MHz], respectively.

Figures 9(a) and 10(a) show the vectors and optimization results for the multimedia service mode. Since the throughput and data rate are the most important measures in the multimedia service mode, we give more weights to f_2 and f_4 to obtain a higher modulation index and a wider bandwidth, and thus, the optimization yields a set with the highest modulation index (16) and the widest bands (Band 2 and Band 4 in the spectrum bands of [250 MHz, 260 MHz] and [210 MHz, 220 MHz], respectively).

Figures 9(b) and 10(b) show the vectors and optimization results for the high reliability service



Figure 9. Optimized sets for the (a) multimedia service mode, (b) high reliability service mode, and (c) low PU interference service mode in the spectrum band of [250 MHz, 260 MHz].



(c) Low PU interference service mode

Figure 10. Optimized sets for the (a) multimedia service mode, (b) high reliability service mode, and (c) low PU interference service mode in the spectrum band of [210 MHz, 220 MHz].

mode. In this mode, the SU needs a low BER to transmit data with a high reliability. The highest transmit power (23 dBm), the lowest modulation index (2), and the narrowest SU bandwidth (10 kHz) are selected from the figures. On the other hand, Band 2 is selected due to the weight value of f_3 being the second largest.

Figures 9(c) and 10(c) show the vectors and optimization results for the low PU interference mode, where we can observe that the lowest transmit power $(\frac{23}{16} \text{ dBm})$ and the narrowest SU bandwidth (10 kHz) are selected. On the other hand, the largest modulation index (16) is selected due to the weight value of f_2 being the second largest.

5. Conclusion

A novel multiple OFF has been proposed to provide the SU with an optimized transmission parameter set in DSA systems. Including the spectrum band index as a new optimization parameter, we have modeled the multiple OFF as a weighted sum of four individual OFFs. Subsequently, we have designed the four individual OFFs, based on the performance measures associated with the transmission parameters, and then, we have obtained the multiple OFF by combining the designed four individual OFFs. Numerical results demonstrate that the individual OFFs achieve their goals, and also, the multiple OFF performs well in optimizing the SU transmission parameters under a variety of scenarios.

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