

PSO-CCO_MIMO-SA: A particle swarm optimization based channel capacity optimization for MIMO system incorporated with smart antenna

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ABSTRACT

With the radio channels physical limits, achieving higher data rate in the multi-channel systems has been a biggest concern. Hence, various spatial domain techniques have been introduced by incorporating array of antenna elements (i.e., smart antenna) in recent past for the channel limit expansion in mobile communication antennas. These smart antennas help to yield the improved array gain or beam forming gain and hence by power efficiency enhancement in the channel and antenna range expansion. The use of smart antenna leads to spatial diversity and minimizes the fading effect and improves link reliability. However, in the process of antenna design, the proper channel modelling is the biggest concern which affects the wireless system performance. The recent works of MIMO design systems have discussed the issues in number of antenna selection which suggests that optimization of MIMO channel capacity is required. Hence, a Particle Swarm Optimization based channel capacity optimization for MIMO system incorporated with smart antenna is introduced in this paper. From the outcomes it is found that the proposed PSO based MIMO system achieves better convergence speed which results in better channel capacity.

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1. INTRODUCTION

The channel capacity has become a majorly considerable parameter in today's and upcoming wireless systems for the communication [1]. Generally, the channel capacity of a fading channel can be referred as the sum of all the narrow band flat fading channel capacities at every discrete frequency points [2]. Hence, various radio techniques have been evolved in recent past where wideband technique has come up with better data communication rate for the short range wireless system [3]. The reason behind the higher data communication with the wideband technique is that it exhibits higher bandwidth of 3.1GHz to 10.6GHz [4, 5]. The channel capacity of MIMO system in a wireless communication system is higher than the conventional system under multi-path environment scenario [6]. Most of the existing systems have discussed the channel capacity of the MIMO system but lack with researches associated with the smart antenna and MIMO system channel capacity optimization mechanisms [7, 8]. The previous work of Shivapanchakshari and [9, 10] have discussed about the complexity improvement as well as performance enhancement for the smart antenna system. This paper aims to extend the work of [9, 10] with respect to channel capacity optimization and array pattern in MIMO and Smart antenna system by introducing an

optimizer based on particle swarm optimization (PSO technique). In this, paper the cost function is considered with PSO for non-smooth and discontinuous antenna pattern. The manuscript is categorized into different sections which includes: review of existing researches intended to enhance the channel capacity of MIMO-smart antenna by adapting various methodologies (section 2) along with research gap and problem statement. The adapted research methodology (section 3) along with the algorithm implementation is discussed in section 4. The analysis of the simulation results are discussed in section-5 while the conclusive points and future scope of the manuscript is highlighted in section 6.

2. REVIEW OF LITERATURE AND RESEARCH GAP

This section discusses various researches towards performance enhancement in the wireless communication with the MIMO systems. A recent work of Piazza et al., [11], have investigated the performance scenarios in broadband and narrowband MIMO systems by introducing the bi-port reconfigurable patch antenna. The study has considered field measurements from the indoor environment for channel capacity at both communication ends. The outcomes were analysed with nonline of sight and line of sight cases of polarization and found that the techniques can be applicable to both broadband and narrowband MIMO systems. A work of Nielsen et al., [12] MIMO channel capacity measurement for the smartphone under data mode operation. The channel measurement is carried out for different frequency bands from the base station in free space with 12 users. The outcomes are measured for random channel capacities in terms of outage capacity. The limitation factor of this [12] work is that it has not conducted the performance analysis with the existing research. An interesting work of Chang and Hu [13] has discussed the design perspectives of the smart antenna and their implementation in the advanced communication system. The work suggests that the use of the smart antenna in the communication system enhances the network capacity. The author has expanded his ideas with the different smart antenna analysis, multibeam MIMO antenna etc. The performance analysis of the handheld MIMO channel under noise and interference condition is conducted in Plicanic et al., [14] by using 3-antenna (multiple) configuration. The communication performance is measured by considering the multipath channel under interference and noise condition which obtains the improved channel capacity. Rosas and Oberli [15] have introduced an attractive MIMO technique to minimize the power consumption where the MIMO channel capacity is improved with large diversity gain and optimal power usage. Shelzinger et al. [16] have presented a Gaussian channel capacity for MIMO under power constrained condition and achieved the secrecy capacity improvement.

The recent work of Leftah and Alminshid [17] have presented a discrete transform based MIMO-OFDM system under channel fading condition and used different amplitude modulation techniques. The performance of the system is been measured with Bit Error Rate (BER) and system channel capacity. From the comparison with the existing system it is been observed that the discrete transform based MIMO-OFDM offers better channel capacity than the conventional MIMO-OFDM systems. Similar kind of work is observed in Duong [18] (improved channel capacity), Singal and Kedia [19] (performance analysis of MIMO antenna selection mechanism).

Also, other researches were tried to improve the MIMO channel capacity using different techniques i.e., Wong et al., [20], Xu et al., [21], Yang Li et al., [22], Yixin Li et al., [23, 24], Zhang et al., [25], Guo et al., [26], Shafie et al. [27], Jiang et al. [28, 29], Wang et al. [30], Wong et al. [31], Akhtar and Gesbert [32], Ho et al., [33]. From the above research survey, it is been observed that most of the researches were considered MIMO and antenna techniques separately for wireless communication performance enhancement and very rare researches were observed with the combination of both. Also, it is been observed that least number of works were focused on the optimization of channel capacity. Thus, the problem statement is *“need of optimization technique which can offer optimized channel capacity in MIMO system at different scenario”*.

3. PROPOSED MODEL OF CHANNEL CAPACITY OPTIMIZATION

The proposed system of PSO based channel capacity optimization (CCO) for MIMO incorporated smart antenna (SA) (PSO-CCO_MIMO-SA) aims to perform the optimization of channel capacity which is rarely addressed in the research domain. The proposed model is the continuation of [10] work. The MIMO system uses Binary Phase Shift Keying (BPSK) modulation technique for the BER calculation. The MIMO system of 2-transmitter (Tx) and 2-Receiver (2-Rx) uses a Rayleigh fading channel for Zero Forcing Equalization (ZFE) which is a linear optimization algorithm used for inverse of channel frequency response. The system is composed of 'Ns' number of symbols/bits, multiple number of Energy per Bit (E_b) to noise power spectral density (N_0) ratio (E_b/N_0). The channel and noise are added and applied PSO to the transmitter unit before forwarding the symbols to the receiver. The consideration of the PSO at the transmitter end helps

to bring better CCO. The Receiver forms a matrix for the ZFE and formats the received symbols to perform the equalization. The receiver takes decision on decoding of the received signal. Finally, the computation of the errors (BER) can be computed. The architectural model of the PSO-CCO_MIMO-SA is given in Figure 1. The design is introduced with the synthesis of the array pattern to maximize the capacity of the channel performance. The system is analysed at scenario-1 (LOS) and scenario-2 (NLOS), where the mean excess delay and root mean square (RMS) delay is adjusted to synthesize of the antenna pattern. However, the synthesis leads to excitation problem in the optimization. Hence, the PSO algorithm is used to perform the regulation of the antenna feed length and achieve better channel capacity. Thus, the signal to noise ratio (SNR) will be improved and BER will be reduced. The system performance can be analysed with respect to scenario-1 (LOS) and scenario-2 (NLOS). The LOS scenario is the direct radio wave propagation between two antennas where the propagation loss is almost similar to the free space impact while NLOS scenario is the improper or partially obstructed wave propagation in which the transmission quality get affected.

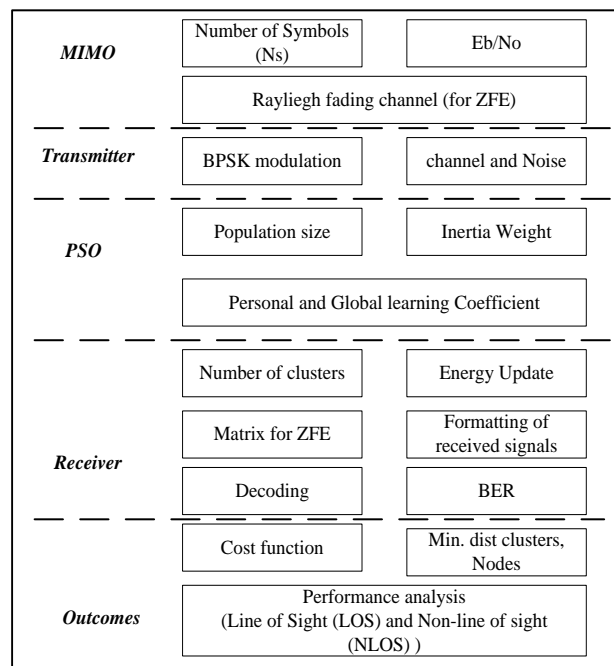


Figure 1. Architecture of the PSO-CCO_MIMO-SA

The channel capacity of the MIMO channel is computed by considering the deterministic matrix (D_m) of Tx, Rx. The capacity of the ' D_m ' is computed by performing the channel decomposition into parallel and scalar white Gaussian sub channels. The element of D_m (real numbers as negative and others as zero). The MIMO system is able to process the signal at both Tx and Rx end and produces the cluster of the received signal at higher capacity. The PSO algorithm is a population-based algorithm and is mainly used for the global optimization problems. The PSO considers only rare parameter adjustment at rapid speed. The use of PSO found in the real numbers than parameter coding and is works on natural bird flocking features. Hence, the proposed model considers PSO for optimization where the antenna excitation voltage and array elements feed length is regulated to get the optimal radiation pattern as well as the enhanced channel capacity. The PSO algorithm is also used in the synthesis process by which the cost function (C_f) can be minimized and is defined as the inverse of channel capacity. The next section discussed the algorithm implementation.

4. ALGORITHM IMPLEMENTATION

The algorithm for the proposed PSO-CCO_MIMO-SA is designed by considering the PSO algorithm in the MATLAB. The algorithm is initialized by using number of samples (N_s), multiple values of E_b/N_0 , number of Tx, Number of Rx (step-1, 2). For the same length of E_b/N_0 , the bits 0, 1 are generated with equal

probability (Step-3). Further, the BPSK modulation scheme is applied (step-4). The Tx and Rx are grouped in a matrix. The Rayleigh channel and white gaussian noise is added to the transmitted symbol (Step-5). The PSO is applied to the transmitted symbol to get the better optimization in the channel capacity, where the number of iterations (N_i), number of population (N_p) or swarm size, inertial weight (I_w), damping of I_w (I_{wd}), PLC, GLC are defined. The numbers of clusters (N_c) are formed in the PSO based on the population size and path. The decision variable (D_v) size and matrix formed based on the generated matrix. Based on the defined velocity of the optimization the PSO evaluates the Global best (P_b) and Personal best (P_b) solution for the selecting the sender randomly. Finally, the energy computation is performed at PSO and updated (Step-6). Once, the implementation of the PSO is done, the Rx will form a ZFE matrix (Step-7) on the basis of cluster of Tx, Rx and this matrix is used to format the received symbols to perform the symbol equalization (Step-8). Later, the Rx will take a decision to decode the received symbol to get in original format (Step-9). The channel capacity is measured by computing the BER in the Rx end (Step-10).

Algorithm for PSO-CCO_MIMO-SA

Input: N_s , E_b/N_0 , Population size, Global Learning Coefficient (GLC), Personal Learning Coefficient (PLC)

Output: BER

Start

1. Initialize \rightarrow MIMO parameters (N_s), E_b/N_0)
2. Consider \rightarrow Tx, Rx
3. Generate \rightarrow bits (0,1)
4. Apply \rightarrow BPSK modulation (bits(0,1))
5. Add \rightarrow channel and Noise (Symbols)
6. Apply \rightarrow PSO
 - a. Initialize $\rightarrow N_i, N_p, I_w, I_{wd}, PLC, GLC$
 - b. Obtain $\rightarrow N_c$ (clusters), Decision variables (D_v)
 - c. Select \rightarrow sender (randomly)
 - d. Update \rightarrow energy
7. Form \rightarrow ZFE matrix
8. Format \rightarrow received symbol
9. Perform \rightarrow decoding at receiver
10. Find \rightarrow BER

End

The algorithm with the antenna array for channel capacity enhancement in the MIMO-SA using is described above where synthesis problem is reformulated as the optimization problem in which the cost function is minimized by adjusting each antenna feed length. The next section discusses on the results analysis of PSO-CCO_MIMO-SA model.

5. RESULTS ANALYSIS

The modelling of the proposed PSO-CCO_MIMO-SA model is performed over MATLAB software. The value of the design parameters is given in Table 1. The model is analyzed in two scenarios (scenario-1) LOS and (scenario-2) NLOS. The mean excess delay (0.25 and 2) and RMS delay (0.49 and 2.02) respectively set for scenario-1 and scenario-2. The optimization process is conducted for 0:10 i.e., 11 E_b/N_0 values. The remaining optimization for each E_b/N_0 value is given in Figure 2. The following Figure 3 gives the variation in the BER with respect to different values of E_b/N where the BPSK modulation is considered for different set of Tx and Rx. The ZFE with Rayleigh channel is compared at drawn to measure the error Rate of (1x1, 1x2 and 2x2) Tx and Rx set.

Table1. Design parameters value

Type	Value
Symbols (N_s)	10^6
E_b/N_0	0:10
Transmitter (Tx)	2
Receiver (Rx)	2
Iterations (N_i)	1000
Population (N_p)	100
Inertia weight (I_w)	1
Damping (I_{wd})	0.99
PLC	1.5
GLC	2.0

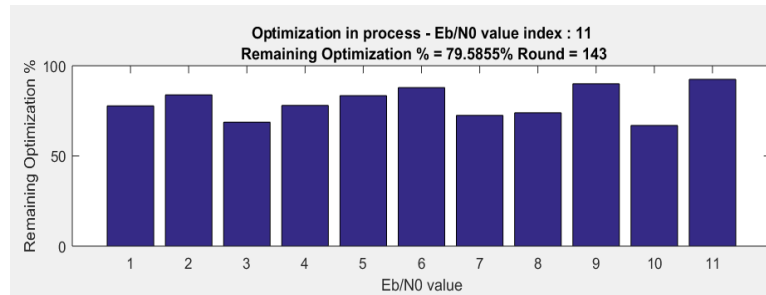


Figure 2. Remaning optimation % with respect to Eb/N0 value

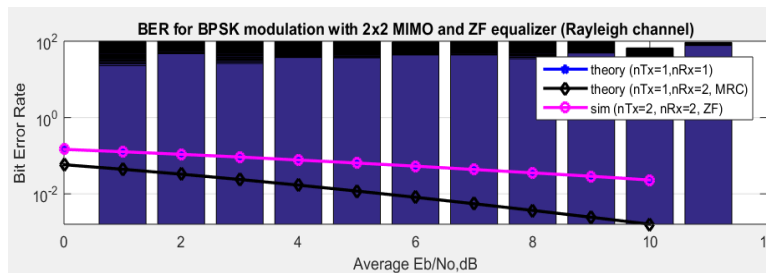
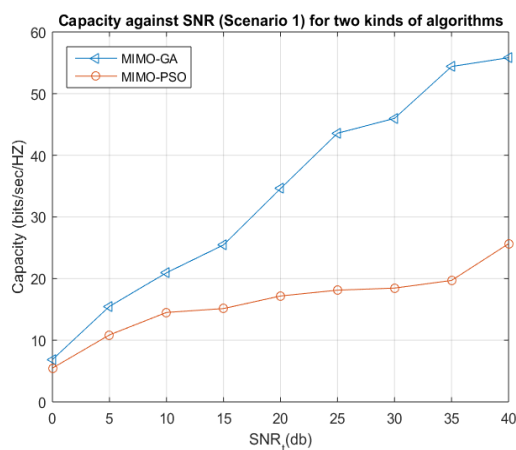
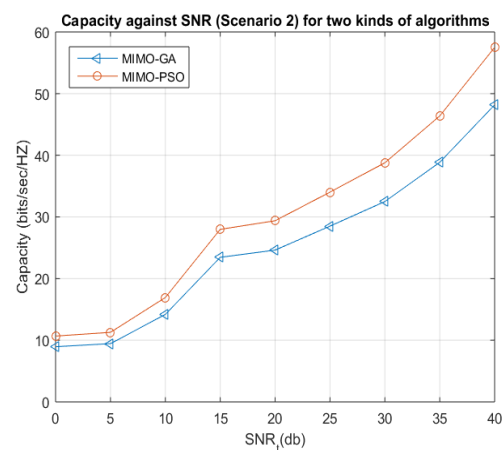


Figure 3. BER Vs Average Eb/N0 at different Tx and Rx set

The performance analysis of the proposed PSO based MIMO system is performed by comparing it with the existing genetic algorithm (GA) based MIMO in both LOS (scenario-1) and NLOS (scenario-2) scenario by considering channel capacity and SNR as performance parameter. Figure 4 gives the channel capacity Vs SNR of 2x2 MIMO systems at scenario-1 and scenario-2 where the SNR is the average transmitting power to noise ratio. From the Figure 4, it is been observed that the channel capacity of proposed PSO based MIMO system is gradually increasing than GA based MIMO as it minimizes the fading and the multipath effects. Also, the synthesized array pattern of the antenna has optimized the processing gain to the receiver. Similarly, the Figure 5 gives the channel capacity Vs SNR of SISO, MIMO and proposed PSO based MIMO systems at scenario-1 and scenario-2. In both the scenarios the proposed PSO based MIMO system channel capacity is better than the other communication systems.



(a)



(b)

Figure 4. Channel capacity Vs SNR at different scenarios (LOS and NLOS),
(a) channel capacity Vs SNR @ Scenario-1, and (b) channel capacity Vs SNR @ Scenario-2

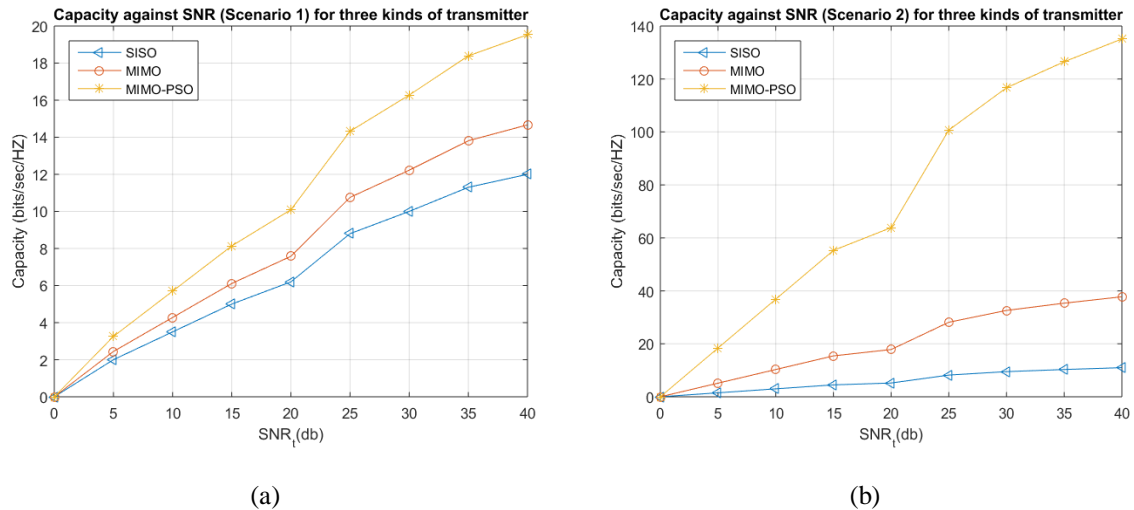


Figure 5. Channel capacity Vs SNR at different communication systems (SISO, MIMO and Proposed PSO based MIMO), (a) channel capacity Vs SNR @ Scenario-1, (b) channel capacity Vs SNR @ Scenario-2

6. CONCLUSION

This paper introduces a PSO-CCO_MIMO-SA system where MIMO system uses binary phase shift keying (BPSK) modulation technique for the BER calculation. The MIMO system of 2-transmitter (Tx) and 2-Receiver (2-Rx) uses a Rayleigh fading channel for zero forcing equalization (ZFE) which is a linear optimization algorithm used for inverse of channel frequency response. The design is introduced with the synthesis of the array pattern to maximize the capacity of the channel performance. The system is analysed for the channel capacity Vs SNR of 2x2 MIMO systems scenario-1 (LOS) and scenario-2 (NLOS) with GA and SISO, MIMO and proposed PSO based MIMO systems. From the outcomes it is been found that the proposed PSO based MIMO system achieves better convergence speed which results in better channel capacity.

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