

# Optimal Distributed Generators and Capacitor Sitting and Sizing in Distribution Systems with Modified Particle Swarm Optimization

G. Balakrishna<sup>1</sup>, Ch. Sai Babu<sup>2</sup>

Department of EEE, Intell Engineering, College, Anantapur, A.P<sup>1</sup>

Department of EEE, JNTUK, Kakinada, A.P<sup>2</sup>

**Abstract:** To ensure the good quality of power in electrical distribution systems, voltages at the different nodes should be within reasonable limits. Shunt capacitor banks installed along with the distribution feeders can supply part of the reactive power required by the inductive loads and hence reduces the voltage drops. Further distributed generators (DGs) also improve the voltage profile as well as provide the local real power generation. The improvement in voltage profile in the system is very much sensitive to the locations and sizes of the shunt capacitor banks as well as distributed generators. In this work, the optimal sitting and sizing of capacitors and DG units are found by the proposed algorithm based on modified particle swarm optimization (MPSO). Loss sensitive factors are used to determine the optimal location of DG units and Shunt capacitor units and their size is obtained by M PSO. The proposed algorithm has been solved by considering multiple objective functions viz., minimization of power loss, minimization of cost function and minimization of deviation of bus voltage. The proposed algorithm has been tested on two test systems i.e., IEEE-33 and IEEE-69 bus systems and results are presented and analyzed.

**Keywords:** Distributed Generators (DGs), Shunt capacitors, Multi objective function, and Modified particle swarm optimization.

## I. INTRODUCTION

In a practical power system network especially in distribution system the system operators are always obligated with voltage levels of each customer bus within the satisfied limits. To ensure good voltage profile in distribution systems, several standards have been established to provide recommendations and stipulations. In general many electrical power supply companies try to maintain/control the distribution voltage variations within the range of  $\pm 5\%$ . One of the most commonly used methods to improve the voltage profiles of distribution systems is connecting shunt capacitor banks along the feeders. Due to the recent advances DGs came into picture to better the voltage profiles further. Distributed Generators (DGs) and Shunt capacitor bank modifies and improves the voltage profile by changing the power flow patterns. Therefore locations of DGs and Shunt capacitor banks have a significant role and impact on the enhancement of voltage profile. In the past two decades, great effort has been contributed to solve the optimal capacitor placement problem that utilizes different methods/algorithms that is based on different objectives.

The optimal capacitor placement problem generally formulated as a mixed integer optimization problem. Several algorithms can help in getting the solution of optimal capacitor placement problem. For instance, a heuristic constructive algorithm (HCA) is presented in [1] where in the integer variable are denoted by a sigmoid function. Another heuristic method is used in [2] to get a near optimal solution for realistic sized systems with an objective function of minimizing harmonic levels, capacitance costs and power losses. This method is

extended to unbalanced loads in [3]. Ant colony search algorithm (ACSA) is used in [4] to get solution to optimal capacitor placement problem and network reconfiguration problem.

The Optimal Capacitor placement and its sizing problem in [5] has an objective function of minimizing the cost subjected to voltage profile limits, capacitor sizes at each bus and power quality limits of harmonics. The effect of placement of capacitor on distribution system reliability is considered in [6] by defining multi objective function i.e. reliability cost, investment cost and cost of power losses. Considerable amount of research has also been done on optimal placement of DG as well. An analytical method is presented in [7] to obtain the optimal location of DG units in radial and networked systems to minimize the power loss. Optimal placement of DGs in [8] is fixed by using exhaustive search to optimize the efficiency and system reliability. In this work the system SAIDI is used to represent the reliability. An iterative based algorithm is given in [9], where in continuous power flow is used to find the most sensitive bus to voltage collapse or maximum loading for DG installation. The objective functions of this include the power loss reduction, power transfer capability improvement and to increase the voltage stability margins.

Genetic algorithm (GA) is used in [10] to find the optimal DG location with various load models. The objective function here is based on multi objective index that considers real and reactive power losses, voltage profile and capacity of DG. Immune Algorithm (IA) is used in [11] to optimize the voltage profiles by changing the

location of DGs with the constraints of bus voltage limits and line current limits.

An algorithm based on GA is used in [12] to find the location, size and type of DGs used in distribution system based on benefit and cost of the DGs. Ch. Chang et al. [13] presented an Ant Colony Search Algorithm for Capacitor and Reconfiguration problem for loss reduction in distribution networks. I. Ch. Silva et al. [14] reported a heuristic constructive algorithm for optimal capacitor placement in distribution system for voltage profile improvement. M. Kalantari et al. [15] proposed a method to find the DG and Capacitors to reduce the losses and improve the voltage profile using GA. M. Wang et al. [16] presented two optimization models to improve the voltage profile, first the DG placement is considered and then the optimal capacitor placement is modeled and solved. It has been presented in literature that the reactive power injected by the shunt capacitor banks can effectively reduce the system energy losses and relieve feeder loading [17] and improves the system reliability [18].

E.G. Carrano et al. [19] reported a method for optimal capacitor placement problem based on Genetic Algorithm to reduce the voltage drops in the distribution system. A. Ahuja et al [50] presented a network reconfiguration and capacitor placement based on Ant Colony Algorithm to reduce the losses and to improve the voltage profile. J.M. Nahman et al. [20] presented an algorithm for optimal capacitor placement problem based on Simulated Annealing (SA) to improve the voltage profile.

## II. MODIFIED PARTICLE SWARM OPTIMIZATION (MPSO)

In fundamental PSO, the velocity of an agent or element can be updated by using equation  $V_{id}^{k+1} = \omega \cdot V_{id}^k + c1 \cdot rand * (Pbest_{id} - S_{id}^k) + c2 \cdot rand * (Gbest_{id} - S_{id}^k)$  ... (1)

The velocity update equation given above has three components:

- i) The first term is used to referred as “Momentum” or “Inertia”. It causes the particle to continue in the same path it has been traveling.
- ii) The second term is meant for local attraction in the direction of the best position of a given particle whose corresponding fitness value is called the particles best ( $P_{best}$ ) scaled by a random weight factor ( $C_1, rand1$ ). This component is referred as “Self knowledge” or “Memory”.
- iii) The third term is used to represent attraction towards the best position of any particle whose corresponding fitness value is called global best ( $G_{best}$ ) scaled by another random weight factor ( $C_2, rand2$ ). This component is referred to “cooperation”, “group knowledge” or “shared information”. In MPSO in addition to the particles with best solution, particles having worst solution are also considered and the velocity update equation is modified as

$$V_{id}^{k+1} = \left[ \begin{array}{l} \omega \cdot V_{id}^k + c1 \times r1 \times k1 \times (Pbest_{id} - S_{id}^k) + \\ c2 \times r2 \times k2 \times (Gbest_{id} - S_{id}^k) + \\ c3 \times r3 \times k3 \times (Pworst_{id} - S_{id}^k) + \\ c4 \times r4 \times k4 \times (Gworst_{id} - S_{id}^k) \end{array} \right] \dots (2)$$

Where,  $C1$  and  $C3$  are the cognitive acceleration coefficients,  $C2$  and  $C4$  are the social acceleration coefficients,  $G_{best}$  is the global best of the entire swarm,  $G_{worst}$  is the global worst of the entire swarm,  $K$  is the previous iteration number,  $K+1$  is the current iteration number,  $K=[k1,k2,k3,k4]$  is switch matrix and its value is  $[1,1,0,0]$  for best particles and  $[0,0,1,1]$  for worst particles,  $P_{best}$  is the particle’s best,  $P_{worst}$  is the particle’s worst  $r1, r2, r3$  and  $r4$  are the random numbers between 0 to 1,  $S_{id}^k$  is the position of  $i^{th}$  particle  $V_{id}^k$  is the velocity of  $i^{th}$  particle. The individual element’s position in  $(k+1)^{th}$  iteration can be modified according to

$$S_{id}^{k+1} = S_{id}^k + V_{id}^{k+1} \dots (3)$$

$i = 1, 2, \dots, n.$   $d = 1, 2, \dots, m.$

Where  $s^k$  is current searching point,  $s^{k+1}$  is modified searching point,  $v^k$  is current velocity,  $v^{k+1}$  is modified velocity of agent  $i$ ,  $v_{pbest}$  is velocity based on  $P_{best}$ ,  $v_{gbest}$  is velocity based on  $g_{best}$ ,  $n$  is number of particles in a group,  $m$  is the number of members in a particles,  $p_{best}$  is  $p_{best}$  of agent  $i$ ,  $g_{best}$  is  $g_{best}$  of the group,  $\omega_i$  is weight function for velocity of agent  $i$ ,  $c_i$  is weight coefficient for each term.

### 2.1 Generation of a particle:

Initialization: Following algorithm is used to generate a particle consisting of real and reactive power outputs of DG units and reactive power rating of capacitor units

- Step 1: Set  $i=1$
- Step 2: Select the active power rating of first DG within the active power generation limits of the respective DG
- Step 3: Repeat step 2 for all DG units
- Step 4: Select the reactive power rating of first DG within the reactive power generation limits of the respective DG
- Step 5: Repeat step 4 for all DG units
- Step 6: Select the reactive power rating of first capacitor rating within the limits of its rating
- Step 7: Repeat step 6 for all the capacitors
- Step 8: increment the particle number i.e.,  $i=i+1$
- Step 9: If all particles are generated stop the initialization process, otherwise go to step 2.

### 2.2 Algorithm for optimal sizing

The algorithm to find the optimal sizes of DGs and capacitors is:

- Step 1: Read the line and load data of the system and DG units data
- Step 2: Calculate the power loss and other objective function values using the distribution load flow for the network before placing
- Step 3: Initialize the particles according to the algorithm given above
- Step 4: For each particle find the objective function according to equation (7)
- Step 5: If the objective function of each particle is better than the previous experience, then update its  $P_{best}$
- Step 6: Find the  $G_{best}$  by considering the fitness value of all the particles

- Step 7: Find the velocity of each particle according to the equation (2)  
 Step 8: Update the velocity and position by using equations (3)  
 Step 9: If the iteration number reaches the maximum limit print the results,  
 Step 10: Otherwise set increase iteration count by one and go back to step 4.  
 Finally the optimal size (Real and reactive power outputs) of DGs and rating of capacitors can be observed from final  $G_{best}$

### III. PROBLEM FORMULATION

The main aim of the proposed MPSO algorithm is to determine the optimal locations and their optimal sizes of the DGs and capacitor units by minimizing the different objective functions. Three objective functions of minimization of power loss, cost function and deviation of bus voltage are considered in this work.

Based on the sensitivity analysis, loss sensitive factors are calculated for all the buses and these are arranged in the decreased order and top order buses are chosen to install DGs and capacitors. The optimal sizes of these units are determined by determining multi-objective function with modified particle swarm optimization subjected to practical constraints.

#### 3.1 Objective Functions:

##### 3.1.1 Minimization of real power loss:

Minimization of power loss is considered as first objective function for the placement of DG.

$$f_1(x) = \text{Minimizing} \sum_{i=1}^{N_b} [I_i]^2 \times R_i \quad \dots (4)$$

Where  $I_i$  is the current through branch 'i' and  $R_i$  is the resistance of branch 'i'.

##### 3.1.2 Minimization of cost function

Cost function minimization is considered as second objective function. Cost function consists of cost of DG units, cost of substation, cost of capacitor units and cost of energy loss. This cost function is considered for 15 years.

$$f_2(x) = \text{Minimizing} \sum_{i=1}^{N_{DG}} C(DG_i) + P_{sub} \times T \times price_{sub} + C(E_L) + \sum_{i=1}^{cn} C(CB_i) \quad \dots (5)$$

Where

- $N_{DG}$  is the number of dg units used
- $C(DG_i)$  is cost of energy generated by the  $i^{th}$  DG units (\$)
- $C(E_L)$  is the cost of energy loss
- $P_{sub}$  is the real power supplied by the substation bus (kWh)
- $Price_{sub}$  is the price of energy at substation in (\$/kWh)
- $C(CB_i)$  is the cost of  $i^{th}$  capacitor bank

In this work three DGs (Fuel cell, photo voltaic and wind turbines) are used and their cost function has taken from [21].

##### 3.1.3. Minimization of deviation of bus voltage (D.V.B)

Minimization of deviation of bus voltages is considered as third objective, mathematically it is given as

$$f_2(x) = \text{Minimizing} \sum_{i=1}^{N_b} |V_r - V_i| \quad \dots (6)$$

Where  $N_b$  is the number of buses or nodes

$V_i$  is the voltage magnitude at  $i^{th}$  bus

$V_r$  is the rated voltage magnitude at  $i^{th}$  bus (1 p.u.)

Finally multi-objective function can be developed as

$$f(X) = \text{Min} \left[ \begin{array}{l} W_1 \times \sum_{i=1}^{N_b} [I_i]^2 \times R_i \\ W_2 \times \left( \sum_{i=1}^{N_{DG}} C(DG_i) + P_{sub} \times T \times price_{sub} + C(E_L) + \sum_{i=1}^{cn} C(CB_i) \right) \\ W_3 \times \sum_{i=1}^{N_b} |V_r - V_i| \end{array} \right] \quad \dots (7)$$

$W_1$ ,  $W_2$  and  $W_3$  are the weighing factors and  $W_1+W_2+W_3=1.0$ .

#### 3.2 Constraints:

The above objective function is solved by considering a set of practical constraints.

- (i) Voltage magnitude constraint
- (ii) Feeder capability constraint
- (iii) Distributed generator constraint
- (iv) Capacitors constraints

### IV. RESULTS AND ANALYSIS

The effectiveness of the proposed MPSO algorithm has tested on IEEE-33 and IEEE-69 radial distribution systems for two cases.

Case-1 system with DG units only

Case-2 system with both DG and capacitor units

The objective function values are calculated by considering a single objective values, three combinations of two objective functions and three objective functions for different weight factors. Weight factors are obtained based on non-dominated solutions that are obtained from Pareto set dominance criterion.

Based on sensitivity analysis three DG units are installed at buses 11, 29 and 31, capacitors are installed at buses 6, 8, 29, 30, 9 and 13 for IEEE-33 bus radial distribution system. Three DG units are installed at buses 60, 63 and 62, capacitors are installed at buses 57, 58, 61, 60, 59 and 15 for IEEE-69 bus radial distribution system.

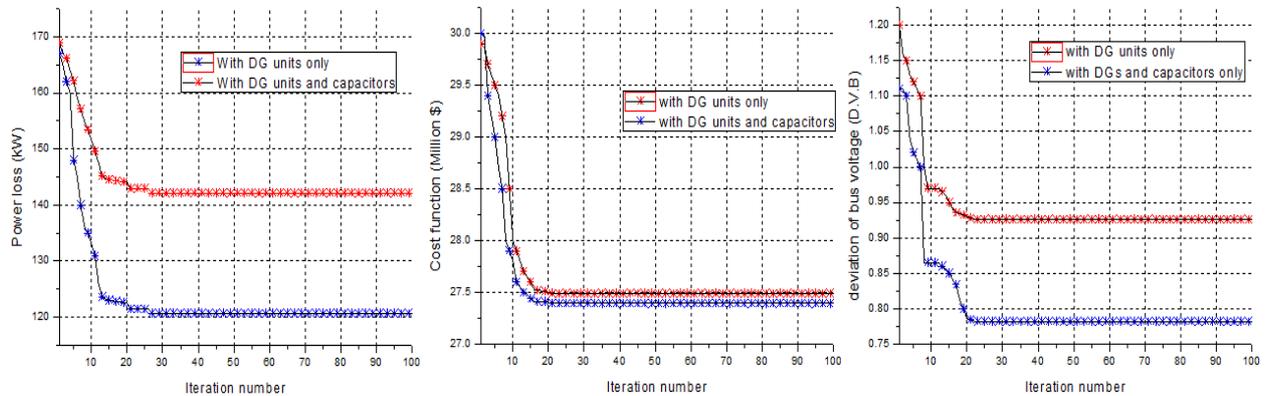
The simulation results of MPSO for IEEE-33 bus system for single objective of minimization of loss, minimization of cost function and minimization of deviation of bus voltage are given in table 1. From these results it is observed that the objective function values have been reduced for the system after placing shunt capacitor units along with the DG units when compared to the system with DG units only. It is also identified from this multi objective MPSO results that, giving importance or priority (allocating higher weight factor) for one objective function does not show much improvement in the other two objective function values.

**TABLE 1: RESULTS OF IEEE-33 BUS SYSTEM FOR SINGLE OBJECTIVE FUNCTIONS**

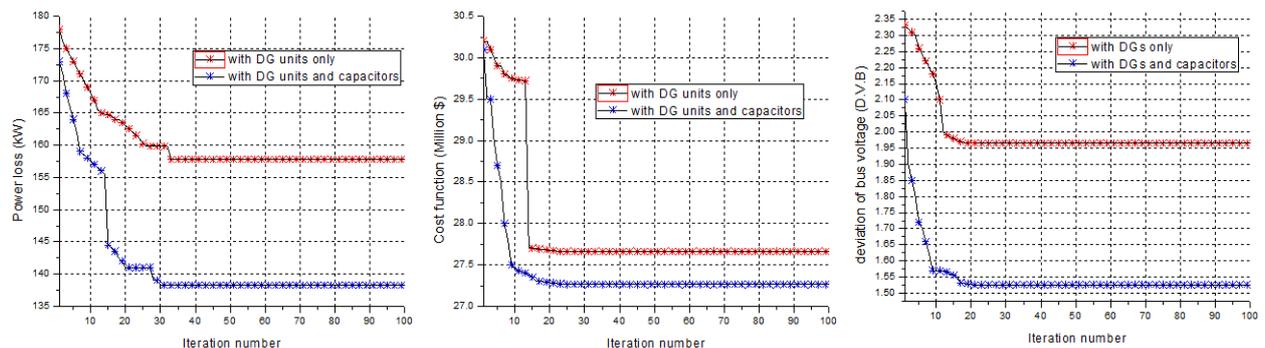
| S.No. | Control Parameter          | Min. of power loss |         | Min. of Cost unction |         | Min. of D.V.B |         |
|-------|----------------------------|--------------------|---------|----------------------|---------|---------------|---------|
|       |                            | Case-1             | Case-2  | Case-1               | Case-2  | Case-1        | Case-2  |
| 1     | $P_{DG1}$ (kW)             | 154.32             | 146.22  | 162.5                | 125.29  | 147.43        | 151.36  |
| 2     | $P_{DG2}$ (kW)             | 59.81              | 59.36   | 59.24                | 46.67   | 64.25         | 71.11   |
| 3     | $P_{DG3}$ (kW)             | 614.38             | 652.97  | 611.20               | 542.84  | 595.24        | 648.25  |
| 4     | $Q_{DG3}$ (kVAr)           | 407.38             | 468.31  | 411.68               | 424.19  | 404.38        | 672.81  |
| 5     | $Q_{c1}$ (kVAr)            | -                  | 164.44  | -                    | 158.36  | -             | 164.25  |
| 6     | $Q_{c2}$ (kVAr)            | -                  | 214.32  | -                    | 207.69  | -             | 198.69  |
| 7     | $Q_{c3}$ (kVAr)            | -                  | 138.77  | -                    | 142.36  | -             | 154.22  |
| 8     | $Q_{c4}$ (kVAr)            | -                  | 78.29   | -                    | 88.21   | -             | 88.64   |
| 9     | $Q_{c5}$ (kVAr)            | -                  | 91.14   | -                    | 92.45   | -             | 102.47  |
| 10    | $Q_{c6}$ (kVAr)            | -                  | 126.36  | -                    | 109.33  | -             | 112.36  |
| 11    | T.P.L                      | 142.14             | 120.71  | 149.48               | 124.97  | 154.37        | 128.71  |
| 12    | Cost function (Million \$) | 27.7999            | 27.6011 | 27.4890              | 27.3917 | 27.8384       | 27.7168 |
| 13    | D.B.V                      | 0.924              | 0.802   | 0.942                | 0.814   | 0.926         | 0.782   |

**TABLE 2: RESULTS OF IEEE-69 BUS SYSTEM FOR SINGLE OBJECTIVE FUNCTIONS**

| S.No. | Control Parameter          | Minimization of power loss |         | Minimization of Cost function |         | Minimization of D.V.B |         |
|-------|----------------------------|----------------------------|---------|-------------------------------|---------|-----------------------|---------|
|       |                            | Case-1                     | Case-2  | Case-1                        | Case-2  | Case-1                | Case-2  |
| 1     | $P_{DG1}$ (kW)             | 164.22                     | 154.98  | 156.55                        | 138.87  | 151.66                | 168.24  |
| 2     | $P_{DG2}$ (kW)             | 56.41                      | 56.77   | 76.22                         | 49.64   | 61.25                 | 74.61   |
| 3     | $P_{DG3}$ (kW)             | 689.35                     | 662.28  | 671.66                        | 608.58  | 628.36                | 632.44  |
| 4     | $Q_{DG3}$ (kVAr)           | 411.47                     | 601.25  | 471.58                        | 614.73  | 438.59                | 621.58  |
| 5     | $Q_{c1}$ (kVAr)            | -                          | 102.37  | -                             | 106.78  | -                     | 108.26  |
| 6     | $Q_{c2}$ (kVAr)            | -                          | 116.27  | -                             | 135.77  | -                     | 127.45  |
| 7     | $Q_{c3}$ (kVAr)            | -                          | 138.57  | -                             | 155.78  | -                     | 148.38  |
| 8     | $Q_{c4}$ (kVAr)            | -                          | 74.25   | -                             | 62.78   | -                     | 61.27   |
| 9     | $Q_{c5}$ (kVAr)            | -                          | 107.87  | -                             | 121.22  | -                     | 106.72  |
| 10    | $Q_{c6}$ (kVAr)            | -                          | 81.87   | -                             | 71.58   | -                     | 84.74   |
| 11    | T.P.L (kW)                 | 158.78                     | 138.26  | 159.44                        | 139.62  | 166.24                | 142.49  |
| 12    | Cost Function (Million \$) | 28.6998                    | 27.2618 | 27.6598                       | 27.2611 | 27.8622               | 27.2806 |
| 13    | D.B.V                      | 1.9652                     | 1.7043  | 2.0017                        | 1.7297  | 1.9647                | 1.5257  |



**Fig.1. Convergence characteristics of MPSO for single objective functions of minimization of power loss, cost function and deviation of bus voltage for IEEE-33 bus system**



**Fig.2. Convergence characteristics of MPSO for single objective functions of min. of power loss, cost function and D.V.B for IEEE-69 bus system**

**TABLE 3: RESULTS OF IEEE-33 BUS SYSTEM FOR TWO OBJECTIVES FOR DIFFERENT WEIGHT FACTORS**

| Set No | Weighing factors |     | Combination-1      |                            |                              |                            | Combination-2              |        |                              |        | Combination-3      |        |                              |        |
|--------|------------------|-----|--------------------|----------------------------|------------------------------|----------------------------|----------------------------|--------|------------------------------|--------|--------------------|--------|------------------------------|--------|
|        | W1               | W2  | With DG units only |                            | With DG units and Capacitors |                            | With DG units only         |        | With DG units and Capacitors |        | With DG units only |        | With DG units and Capacitors |        |
|        |                  |     | T.P.L (kW)         | Cost function (Million \$) | T.P.L (kW)                   | Cost function (Million \$) | Cost function (Million \$) | D.B. V | Cost function (Million \$)   | D.B. V | T.P.L (kW)         | D.B. V | T.P.L (kW)                   | D.B. V |
| 1      | 0.1              | 0.9 | 170.11             | 27.4957                    | 152.47                       | 27.3921                    | 27.8352                    | 0.926  | 27.7244                      | 0.783  | 171.47             | 0.925  | 156.31                       | 0.781  |
| 2      | 0.2              | 0.8 | 170.11             | 27.4957                    | 152.47                       | 27.3921                    | 27.8352                    | 0.925  | 27.7241                      | 0.791  | 167.28             | 0.927  | 151.26                       | 0.789  |
| 3      | 0.3              | 0.7 | 166.46             | 27.6544                    | 151.16                       | 27.4155                    | 27.7149                    | 0.925  | 27.7241                      | 0.791  | 167.28             | 0.927  | 151.26                       | 0.789  |
| 4      | 0.4              | 0.6 | 164.36             | 27.6544                    | 149.16                       | 27.4265                    | 27.7149                    | 0.931  | 27.4272                      | 0.806  | 163.11             | 0.934  | 147.98                       | 0.802  |
| 5      | 0.5              | 0.5 | 164.36             | 27.6544                    | 149.16                       | 27.4265                    | 27.5988                    | 0.931  | 27.4272                      | 0.806  | 163.11             | 0.934  | 147.98                       | 0.802  |
| 6      | 0.6              | 0.4 | 158.49             | 27.7749                    | 141.26                       | 27.5664                    | 27.5988                    | 0.931  | 27.4272                      | 0.806  | 159.27             | 0.938  | 141.21                       | 0.804  |
| 7      | 0.7              | 0.3 | 158.49             | 27.7749                    | 141.26                       | 27.5664                    | 27.4944                    | 0.943  | 27.3838                      | 0.813  | 159.27             | 0.938  | 141.21                       | 0.804  |
| 8      | 0.8              | 0.2 | 149.76             | 27.8391                    | 138.79                       | 27.7172                    | 27.4944                    | 0.943  | 27.3838                      | 0.813  | 151.22             | 0.942  | 137.68                       | 0.812  |
| 9      | 0.9              | 0.1 | 149.76             | 27.8349                    | 138.79                       | 27.7172                    | 27.4944                    | 0.943  | 27.3838                      | 0.813  | 151.22             | 0.942  | 137.68                       | 0.812  |

**TABLE 4: RESULTS OF IEEE-69 BUS SYSTEM FOR TWO OBJECTIVE FUNCTIONS FOR DIFFERENT WEIGHT FACTORS**

| Set No | Weighing factors |     | Combination-1      |                            |                              |                            | Combination-2              |       |                              |       | Combination-3      |       |                              |       |
|--------|------------------|-----|--------------------|----------------------------|------------------------------|----------------------------|----------------------------|-------|------------------------------|-------|--------------------|-------|------------------------------|-------|
|        | W1               | W2  | With DG units only |                            | With DG units and Capacitors |                            | With DG units only         |       | With DG units and Capacitors |       | With DG units only |       | With DG units and Capacitors |       |
|        |                  |     | T.P.L (kW)         | Cost function (Million \$) | T.P.L (kW)                   | Cost function (Million \$) | Cost function (Million \$) | D.B.V | Cost function (Million \$)   | D.B.V | T.P.L (kW)         | D.B.V | T.P.L (kW)                   | D.B.V |
| 1      | 0.1              | 0.9 | 168.38             | 27.6678                    | 143.24                       | 27.2614                    | 28.5411                    | 1.964 | 27.2830                      | 1.526 | 168.61             | 1.961 | 143.18                       | 1.525 |
| 2      | 0.2              | 0.8 | 168.38             | 27.6678                    | 143.24                       | 27.2614                    | 28.5411                    | 1.964 | 27.2830                      | 1.526 | 168.61             | 1.961 | 143.18                       | 1.525 |
| 3      | 0.3              | 0.7 | 165.72             | 27.8741                    | 141.87                       | 27.2678                    | 28.3245                    | 1.972 | 27.2751                      | 1.558 | 164.97             | 1.982 | 141.46                       | 1.552 |
| 4      | 0.4              | 0.6 | 165.72             | 27.8741                    | 141.87                       | 27.2678                    | 28.3245                    | 1.972 | 27.2750                      | 1.558 | 164.97             | 1.982 | 141.46                       | 1.552 |
| 5      | 0.5              | 0.5 | 165.72             | 27.8741                    | 141.87                       | 27.2678                    | 27.9543                    | 1.986 | 27.2704                      | 1.641 | 164.97             | 1.982 | 141.46                       | 1.552 |
| 6      | 0.6              | 0.4 | 162.16             | 28.1187                    | 140.71                       | 27.2746                    | 27.9543                    | 1.986 | 27.2704                      | 1.641 | 162.42             | 1.992 | 140.77                       | 1.639 |
| 7      | 0.7              | 0.3 | 162.16             | 28.1187                    | 140.71                       | 27.2746                    | 27.6571                    | 1.994 | 27.2648                      | 1.641 | 162.42             | 1.992 | 140.77                       | 1.639 |
| 8      | 0.8              | 0.2 | 160.47             | 28.6747                    | 139.22                       | 27.2821                    | 27.6571                    | 1.994 | 27.2648                      | 1.731 | 160.26             | 2.010 | 139.21                       | 1.730 |
| 9      | 0.9              | 0.1 | 160.47             | 28.6747                    | 139.22                       | 27.2821                    | 27.6587                    | 2.011 | 27.2621                      | 1.731 | 160.26             | 2.010 | 139.21                       | 1.730 |

**TABLE 5: RESULTS OF IEEE-33 BUS SYSTEM FOR THREE OBJECTIVE FUNCTIONS FOR DIFFERENT WEIGHT FACTORS**

| S. No. | Weighing Factors |     |     | Case-1 (With DG units only) |                            |        | Case-2 (With DG units and capacitors) |                            |        |
|--------|------------------|-----|-----|-----------------------------|----------------------------|--------|---------------------------------------|----------------------------|--------|
|        | W1               | W2  | W3  | T.P.L (kW)                  | Cost function (Million \$) | D.B.V  | T.P.L (kW)                            | Cost function (Million \$) | D.B.V  |
| 1      | 0.1              | 0.1 | 0.8 | 174.16                      | 27.8417                    | 0.9265 | 128.74                                | 27.7255                    | 0.7824 |
| 2      | 0.1              | 0.8 | 0.1 | 174.16                      | 27.5111                    | 0.9435 | 128.74                                | 27.4021                    | 0.8145 |
| 3      | 0.8              | 0.1 | 0.1 | 152.47                      | 27.8417                    | 0.9435 | 121.41                                | 27.7255                    | 0.8145 |
| 4      | 0.5              | 0.3 | 0.2 | 157.16                      | 27.7047                    | 0.9387 | 122.38                                | 27.5112                    | 0.8109 |
| 5      | 0.5              | 0.2 | 0.3 | 157.16                      | 27.8244                    | 0.9356 | 122.38                                | 27.6458                    | 0.8088 |
| 6      | 0.3              | 0.5 | 0.2 | 163.28                      | 27.6246                    | 0.9387 | 124.62                                | 27.4946                    | 0.8109 |
| 7      | 0.3              | 0.2 | 0.5 | 163.28                      | 27.8244                    | 0.9291 | 124.62                                | 27.6458                    | 0.7911 |
| 8      | 0.2              | 0.5 | 0.3 | 167.87                      | 27.6246                    | 0.9356 | 126.81                                | 27.4951                    | 0.8088 |
| 9      | 0.2              | 0.3 | 0.5 | 167.87                      | 27.7047                    | 0.9292 | 126.81                                | 27.5112                    | 0.7912 |

**TABLE 6: RESULTS OF IEEE-69 BUS SYSTEM FOR THREE OBJECTIVE FUNCTIONS FOR DIFFERENT WEIGHT FACTORS**

| S. No. | Weighing Factors |     |     | Case-1 (With DG units only) |                            |       | Case-2 (With DG units and capacitors) |                            |       |
|--------|------------------|-----|-----|-----------------------------|----------------------------|-------|---------------------------------------|----------------------------|-------|
|        | W1               | W2  | W3  | T.P.L (kW)                  | Cost function (Million \$) | D.B.V | T.P.L (kW)                            | Cost function (Million \$) | D.B.V |
| 1      | 0.1              | 0.1 | 0.8 | 166.34                      | 26.7742                    | 1.964 | 142.54                                | 27.2636                    | 1.527 |

|   |     |     |     |        |         |       |        |         |       |
|---|-----|-----|-----|--------|---------|-------|--------|---------|-------|
| 2 | 0.1 | 0.8 | 0.1 | 166.34 | 28.7142 | 2.002 | 142.54 | 27.2811 | 1.731 |
| 3 | 0.8 | 0.1 | 0.1 | 158.27 | 28.7142 | 2.002 | 138.47 | 27.2811 | 1.731 |
| 4 | 0.5 | 0.3 | 0.2 | 160.76 | 28.2741 | 1.999 | 139.21 | 27.2785 | 1.687 |
| 5 | 0.5 | 0.2 | 0.3 | 160.76 | 28.4126 | 1.994 | 139.21 | 27.2701 | 1.649 |
| 6 | 0.3 | 0.5 | 0.2 | 162.19 | 27.8678 | 1.999 | 140.68 | 27.2785 | 1.687 |
| 7 | 0.3 | 0.2 | 0.5 | 162.19 | 28.4126 | 1.987 | 140.68 | 27.2686 | 1.611 |
| 8 | 0.2 | 0.5 | 0.3 | 164.44 | 27.8681 | 1.994 | 141.71 | 27.2701 | 1.649 |
| 9 | 0.2 | 0.3 | 0.5 | 164.44 | 28.2744 | 1.987 | 141.71 | 27.2686 | 1.611 |

The multi objective MPSO results of IEEE-33 bus system for two objective functions in three combinations and three objective functions for different weight factors are given table 3 and 5. Convergence characteristics of the MPSO for IEEE-33 bus system for single objective function are shown in fig.1. For an IEEE-69 bus system MPSO results for single objectives are given table 2 and MOMPSO results for two and three objectives are given in table 4 and 6. Convergence characteristics of the MPSO for IEEE-69 bus system for single objective function are shown in fig.2.

### V. CONCLUSION

In this work an algorithm based on modified particle swarm optimization is tested by solving multi objective DG and capacitor sitting and sizing problem. Loss sensitive factors are used to identify the sensitive nodes to place the DG units and capacitor units and their size is obtained by modified particle swarm optimization (MPSO) by minimizing multiple objective functions subjected to a practical constraints. It is identified from results that the power loss, cost function and deviation of bus voltage are reduced after including the DG units and capacitors simultaneously.

### REFERENCES

[1] I. C. da Silva, S. Carneiro, E. J. de Oliveira, J. de Souza Costa, J. L. Rezende Pereira, and P. A. N. Garcia, "A Heuristic Constructive Algorithm for Capacitor Placement on Distribution Systems," IEEE Transactions on Power Systems, vol. 23, pp. 1619-1626, 2008.

[2] B. Gou and A. Abur, "Optimal capacitor placement for improving power quality," proceedings of IEEE Power Engineering Society Summer Meeting, 1999, pp. 488-492, vol.1.

[3] G. Carpinelli, P. Varilone, V. Di Vito, and A. Abur, "Capacitor placement in three-phase distribution systems with nonlinear and unbalanced loads," Generation, Transmission and Distribution, IEE Proceedings-, vol. 152, pp. 47-52, 2005.

[4] C. Chung-Fu, "Reconfiguration and Capacitor Placement for Loss Reduction of Distribution Systems by Ant Colony Search Algorithm," IEEE Transactions on Power Systems, vol. 23, pp. 1747-1755, 2008.

[5] M. Ladjavardi and M. A. S. Masoum, "Genetically Optimized Fuzzy Placement and Sizing of Capacitor Banks in Distorted Distribution Networks," IEEE Transactions on Power Delivery, vol. 23, pp. 449-456, 2008.

[6] A. H. Etemadi and M. Fotuhi-Firuzabad, "Distribution system reliability enhancement using optimal capacitor placement," Generation, Transmission & Distribution, IET, vol. 2, pp. 621-631, 2008.

[7] W. Caisheng and M. H. Nehrir, "Analytical approaches for optimal placement of distributed generation sources in power systems," IEEE Transactions on Power Systems, vol. 19, pp. 2068-2076, 2004.

[8] D. Zhu, R. P. Broadwater, T. Kwa-Sur, R. Seguin, and H. sgeirsson, "Impact of DG placement on reliability and efficiency with time-varying loads," IEEE Transactions on Power Systems, vol. 21, pp. 419-427, 2006.

[9] H. Hedayati, S. A. Nabaviniaki, and A. Akbarimajd, "A Method for Placement of DG Units in Distribution Networks," IEEE Transactions on Power Delivery, vol. 23, pp. 1620-1628, 2008.

[10] D. Singh and K. S. Verma, "Multiobjective Optimization for DG Planning With Load Models," IEEE Transactions on Power Systems, vol. 24, pp. 427-436, 2009.

[11] M. R. Aghaebrahimi, M. Amiri, and S. H. Zahiri, "An immune-based optimization method for distributed generation placement in order to optimize voltage profile," International Conference on Sustainable Power Generation and Supply, SUPERGEN '09., 2009.

[12] T. Jen-Hao, L. Tain-Syh, and L. Yi-Hwa, "Strategic distributed generator placements for service reliability improvements," in proceeding of IEEE Power Engineering Society Summer Meeting, 2002, pp. 719-724, vol.2.

[13] Ch. Chang et al., "Reconfiguration and Capacitor Placement for Loss reduction of Distribution Systems by Ant Colony Search Algorithm," IEEE Transactions on Power Systems, Vol. 23, No.4, Nov, 2008.

[14] I. Ch. Silva et. al., "A Heuristic Constructive Algorithm for Capacitor placement on Distribution Systems," IEEE Transactions on Power systems, Vol. 23, No.4, Nov, 2008.

[15] M. Kalantari et. al., "Placement of Distributed Generation unit and Capacitor Allocation in Distribution Systems using Genetic Algorithm", 10<sup>th</sup> International Conference on Environment and Electrical Engg., EEEIC pp 1-5, 2011

[16] M. Wang et. al., "A Novel Method for Distributed Generation and Capacitor Optimal Placement considering voltage profiles", IEEE power and energy Society General Meeting, pp 1-6 July, 2011.

[17] R. A Gallego, A. Monticelli, R. Romero, "Optimal Capacitor placement in Radial Distribution Networks," IEEE Trans. Power Systems, Vol. 16, pp. 630-637, November, 2001

[18] E.G. Carrano, R. T. N. Cardoso, R.H.C Takahashi, C. M. Fonseca, O. M. Neto, "Power Distribution Network Expansion Scheduling using Dynamic Programming Genetic Algorithm," IET, Generation, Transmission and Distribution, Vol.2, pp 444-455, May, 2008

[19] A. Ahuja, S. Das, A. Pahwa, "An AIS-ACO Hybrid Approach for Multi-objective Distribution Reconfigurfation". IEEE Trans. Power Systems, Vol.22, pp. 1101-1111, August, 2007.

[20] J.M. Nahman, D.M. Peric, "Optimal Plammomg of Radial Distribution Networks by Simulated Annealing Technique," IEEE Trans. Power Systems, Vol. 23, pp 790-795, May, 2008.

[21] Teher Niknam, et al "A modified honey bee mating optimization algorithm for multiobjective placement of renewably energy sources", Journal of Applied Energy, July, 2011.